

Master Module  
Proteinbiochemistry and Bioinformatics  
March 2022

# Protein interaction networks

Katja Luck, PhD

# Some organizational information

- Questions throughout the lecture are welcome
- I will ask questions, too!
- Happy to receive feedback on the course

# Outline

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1. What are protein interactions?

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2. Methods to detect protein interactions

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2. Methods to detect protein interactions
3. Bioinformatic resources for protein interactions
4. Graph theoretical aspects of protein interaction networks
5. Visualizing and analyzing networks using Cytoscape

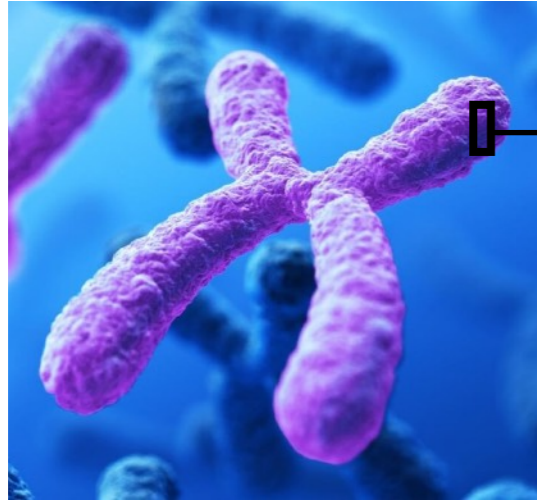


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Session: Protein interaction networks

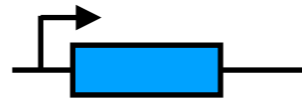
1. What are protein interactions?

# Why do protein interactions matter?

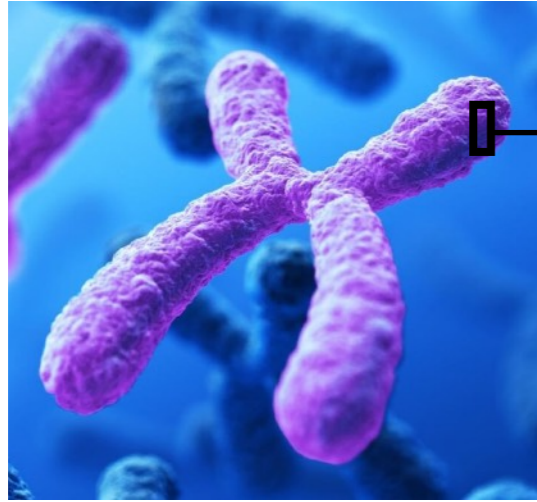


humanoriginproject.com

Gene X functions in Y - How?



# Why do protein interactions matter?



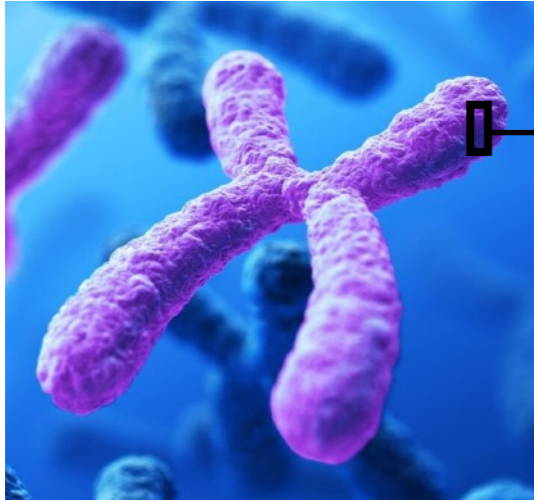
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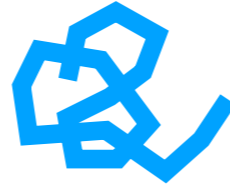
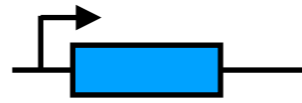
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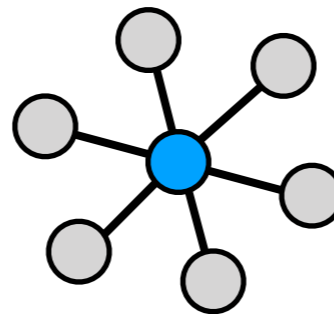


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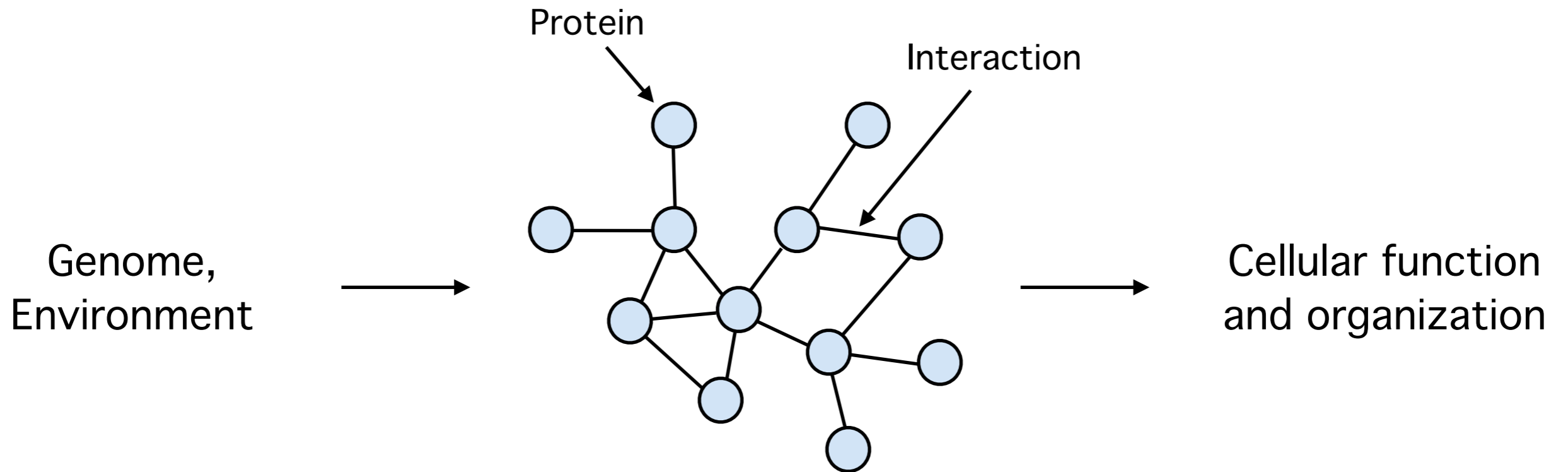


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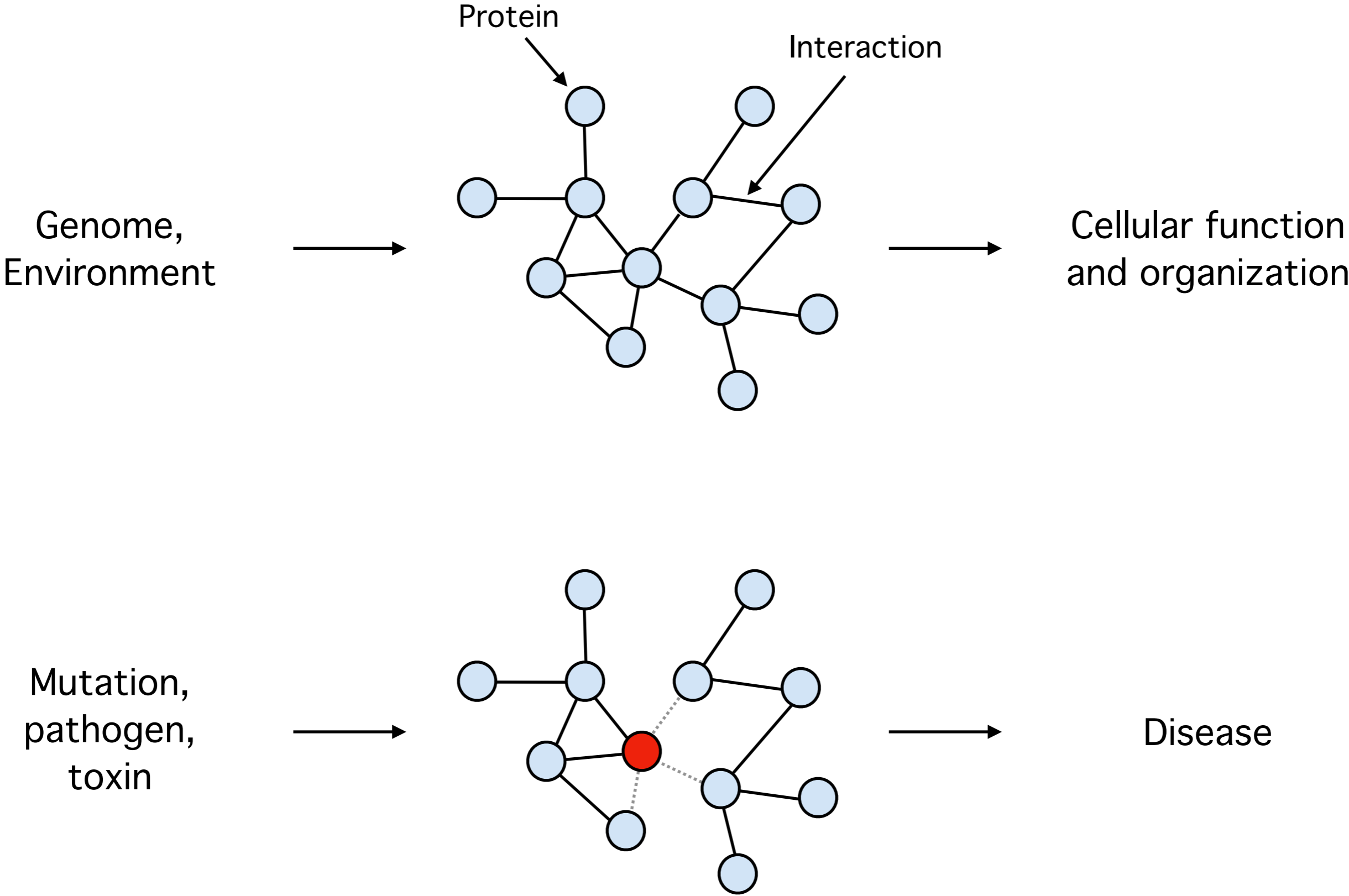


- Interactions mediate a gene's function
- Interactions inform on a gene's function

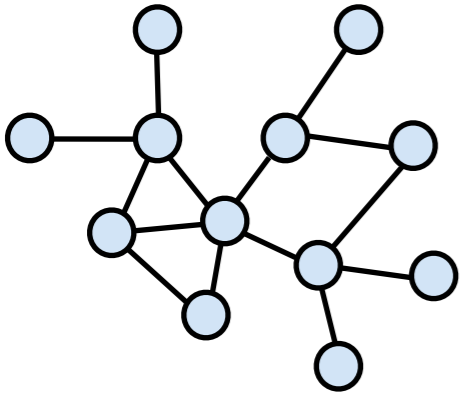
# Protein interactions mediate cellular function



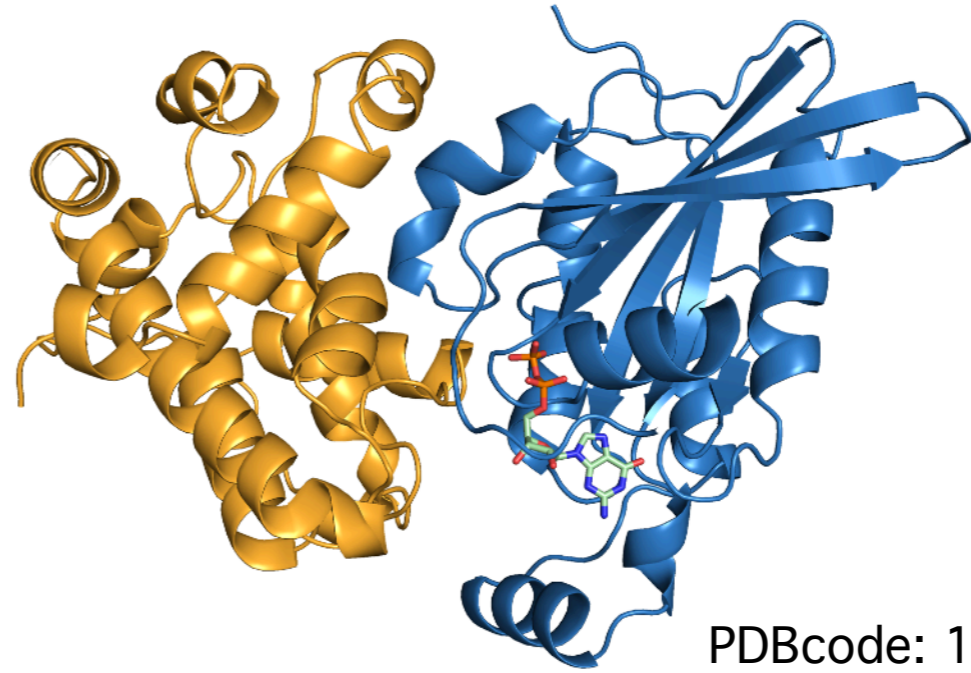
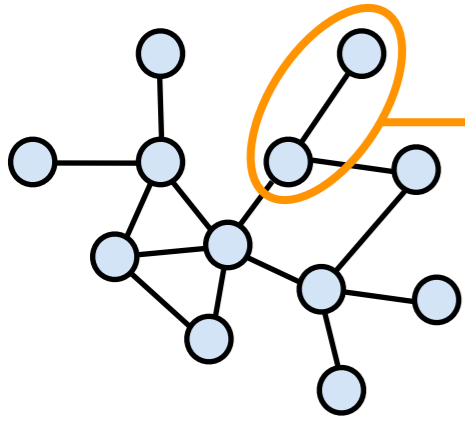
# Protein interactions mediate cellular function



# Protein interactions are complex



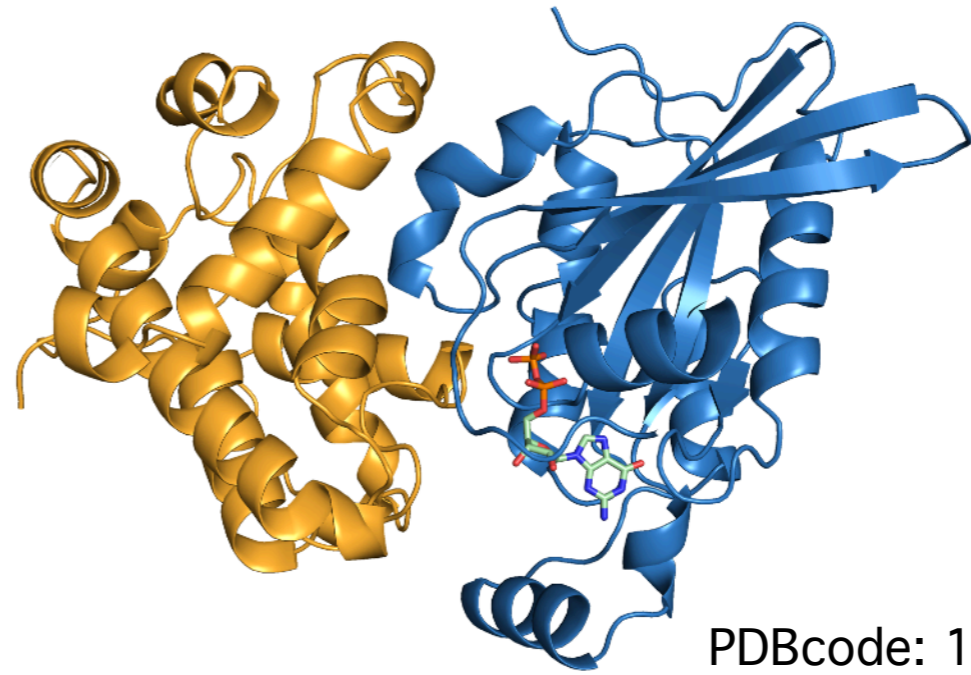
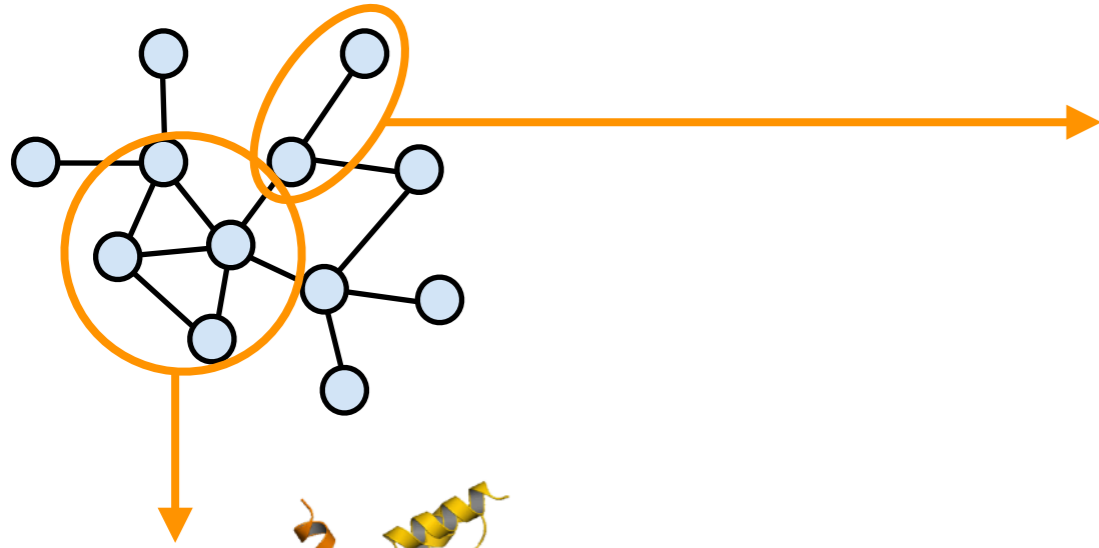
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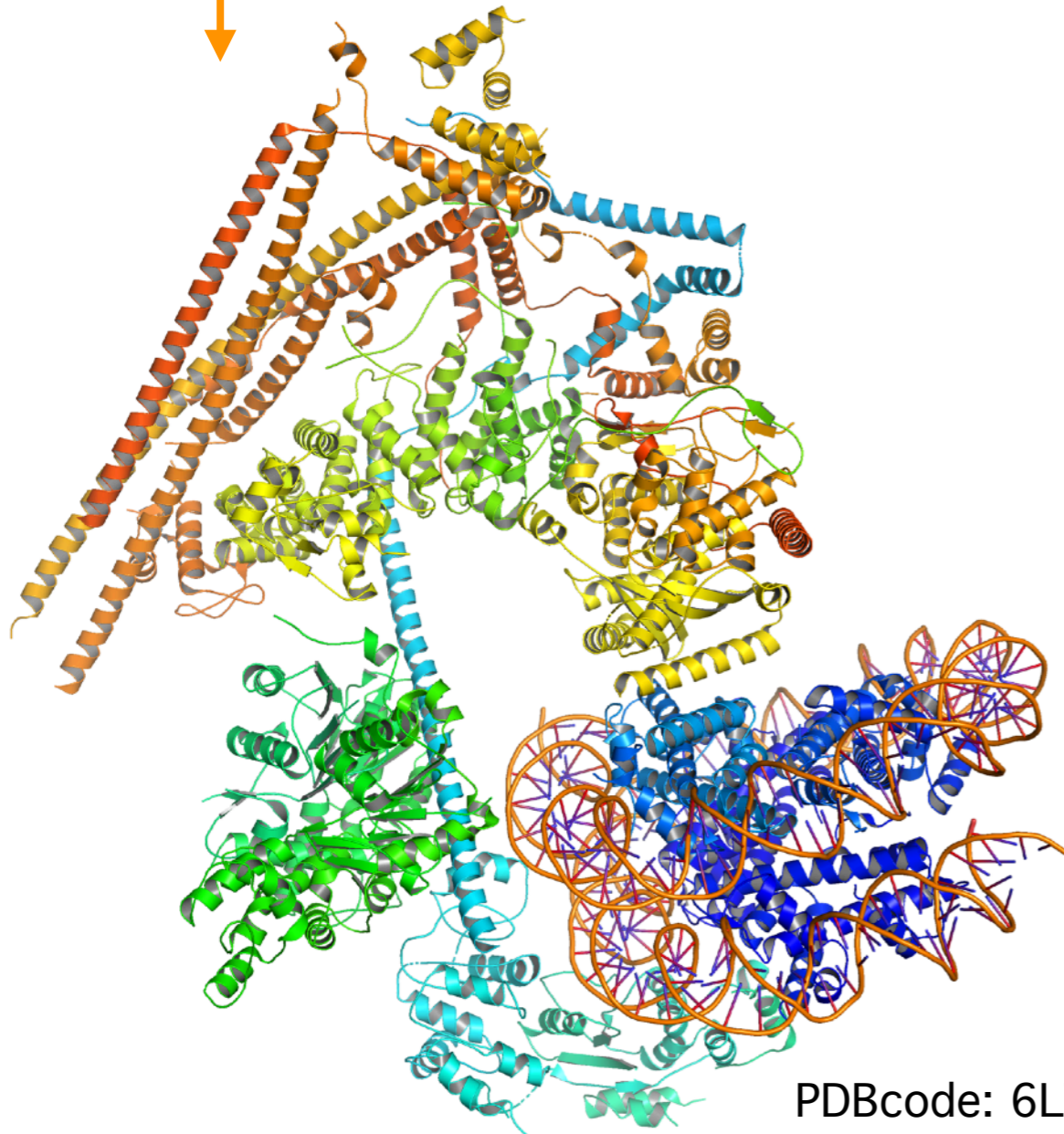
PDBcode: 1GRN



# Protein interactions are complex

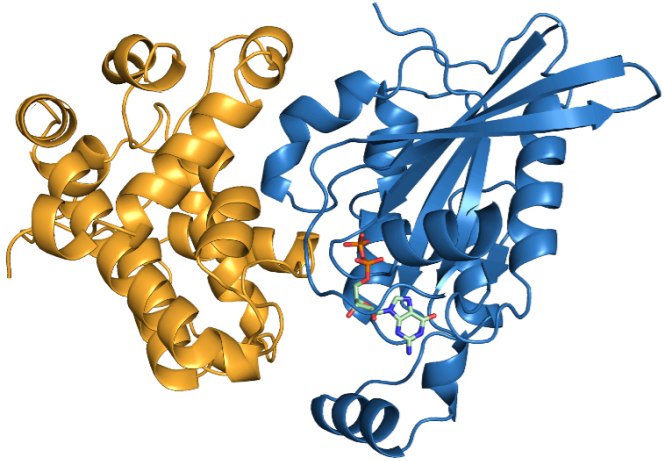


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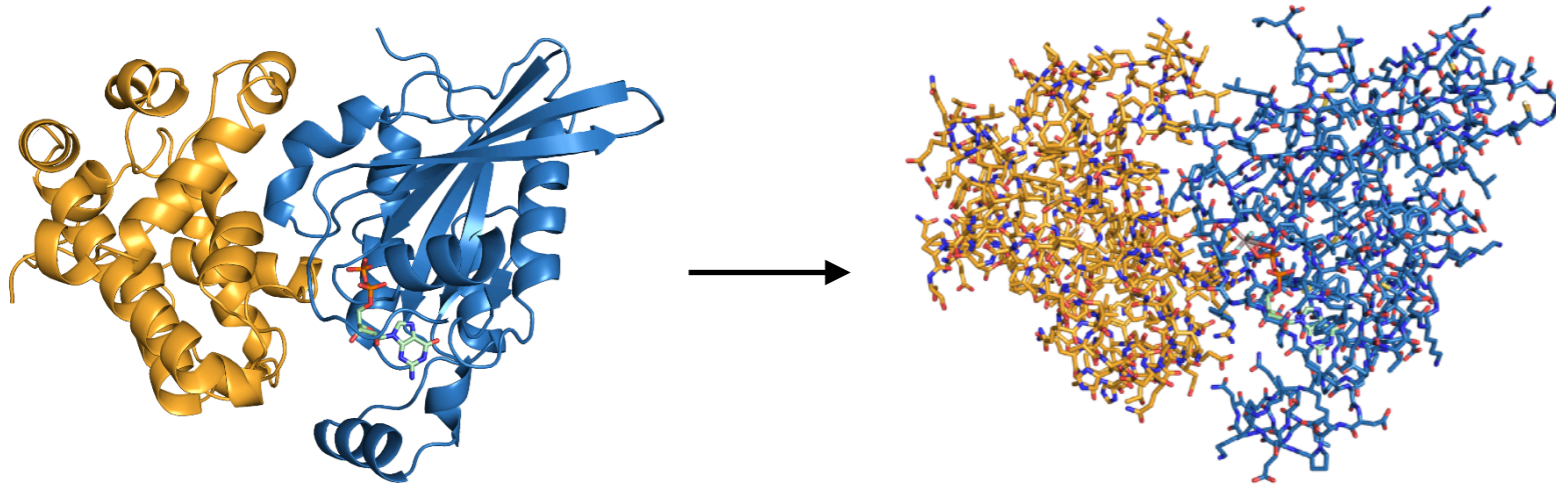


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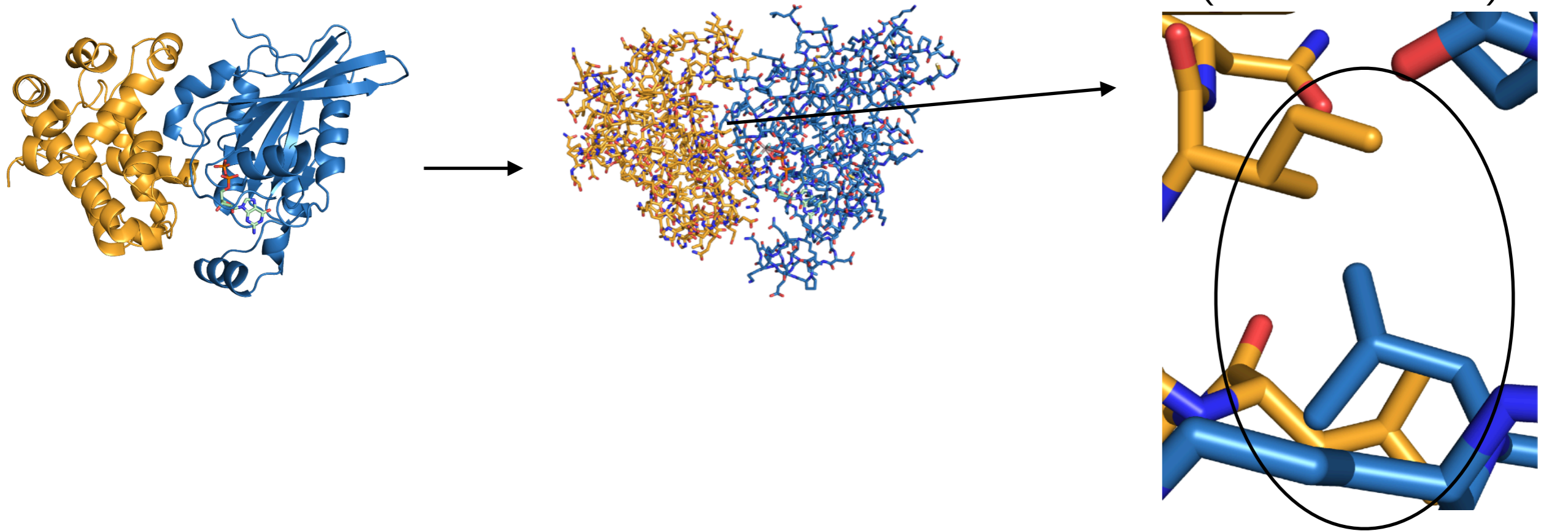
# Non-covalent contacts between amino acids mediate protein interactions



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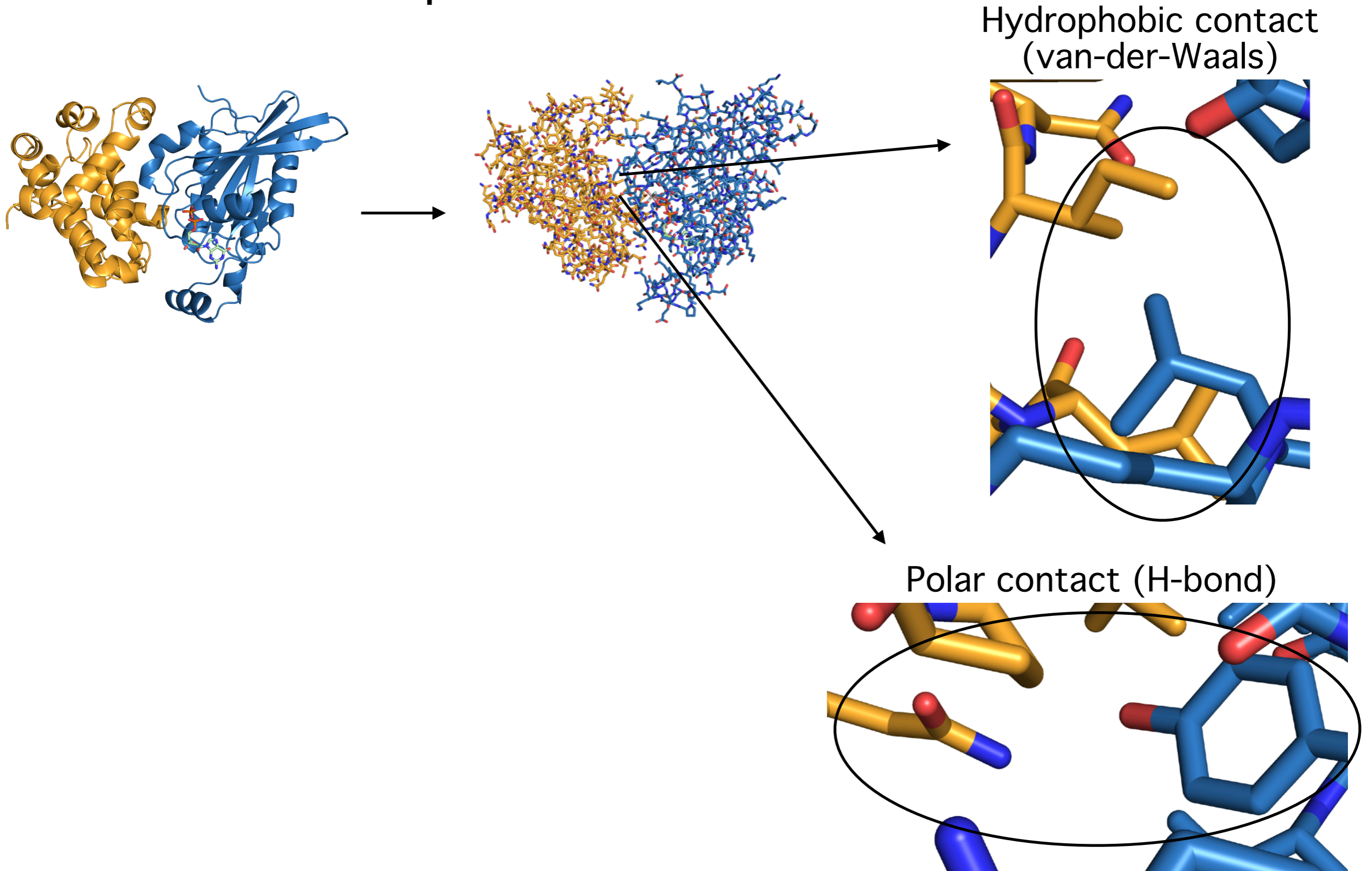


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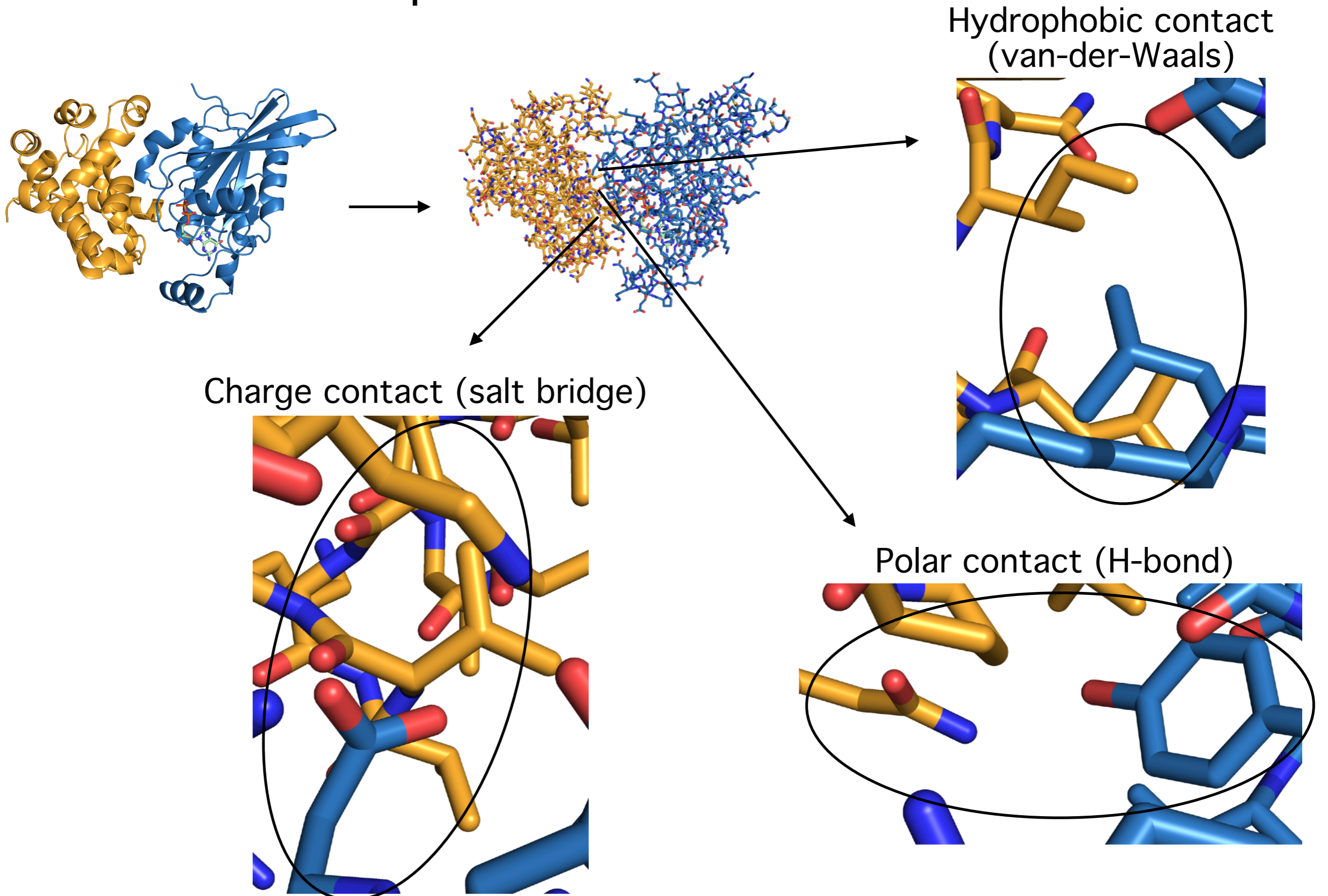




# Non-covalent contacts between amino acids mediate protein interactions



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dissociation constant  $K_D$



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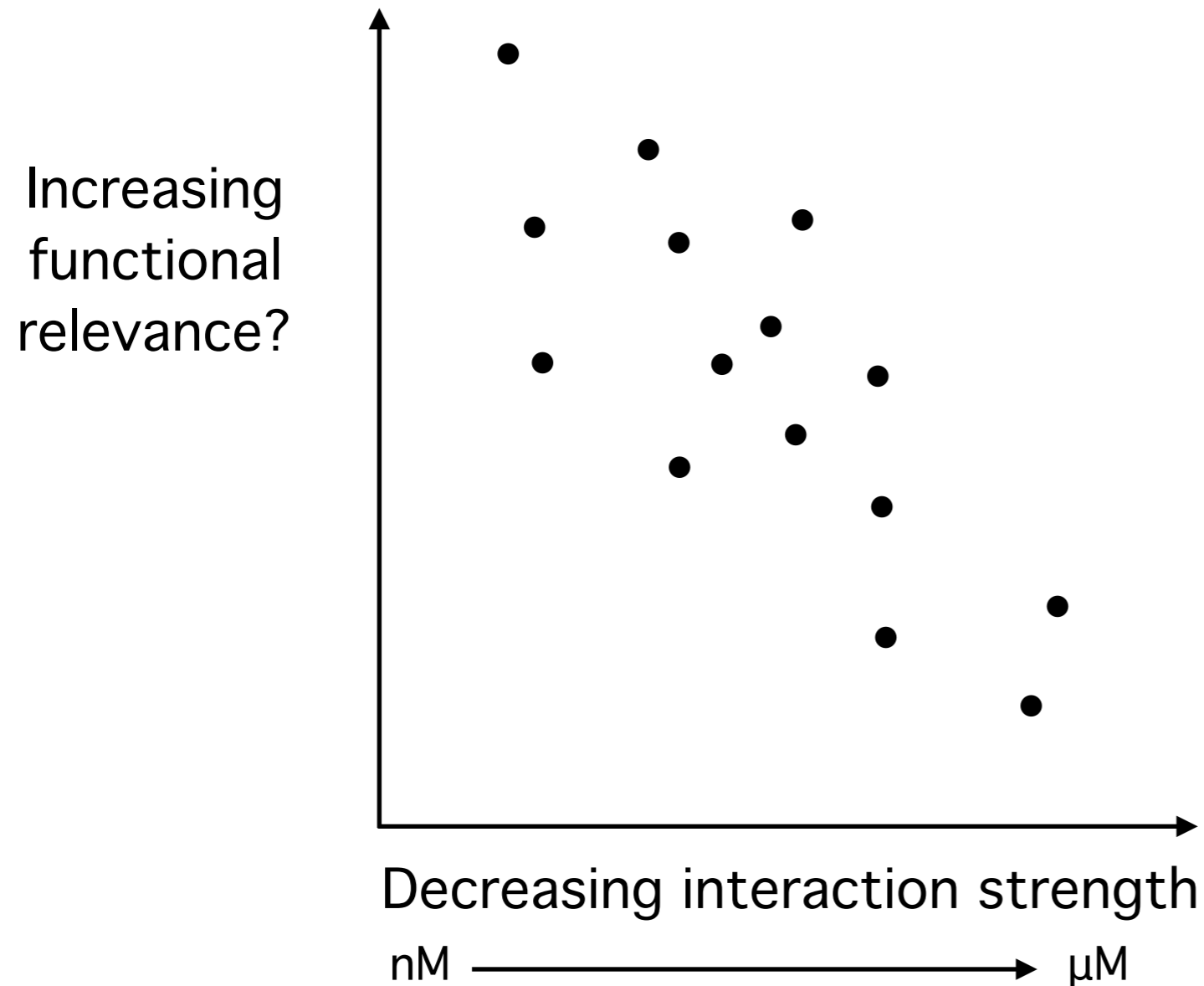
- the smaller the  $K_D$ , the stronger the interaction
- nM  $\rightarrow$  very strong,  $\mu$ M  $\rightarrow$  rather weak
- it is a continuum!

# When can we say that two proteins interact with each other?

- interaction strength ( $K_D$ ) is a continuum
- there is no universal cutoff on the  $K_D$
- discrimination into binding/no binding is assay-dependent

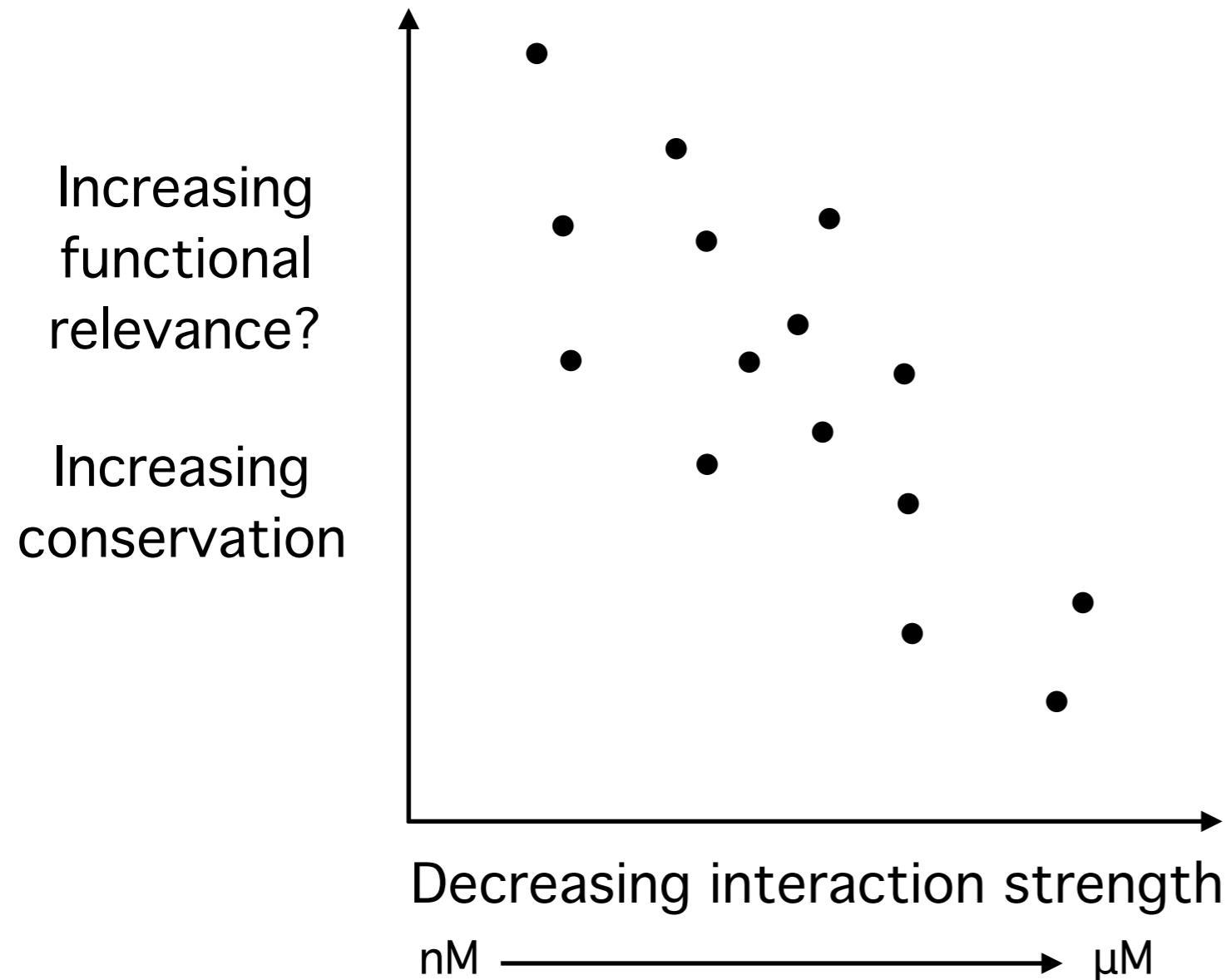
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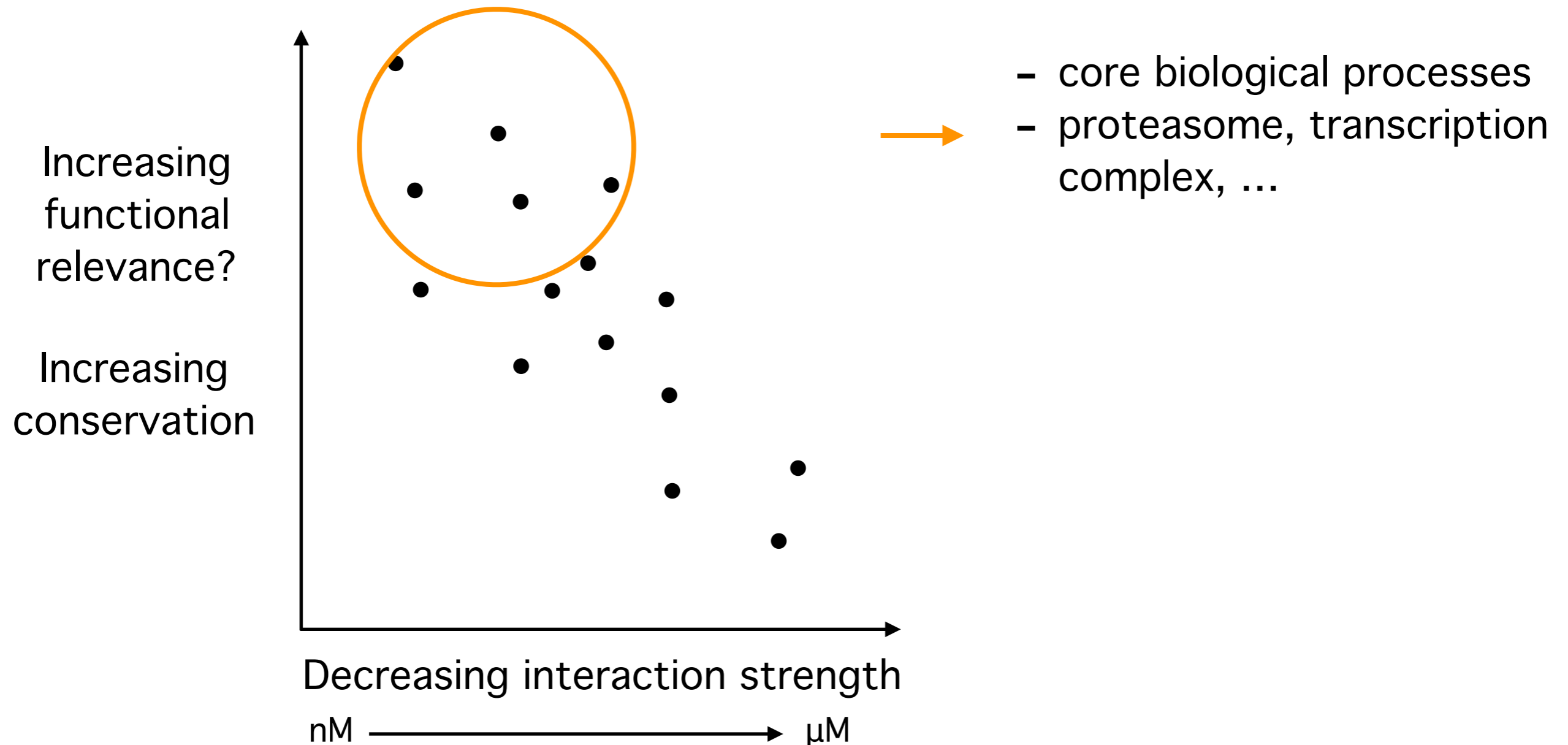
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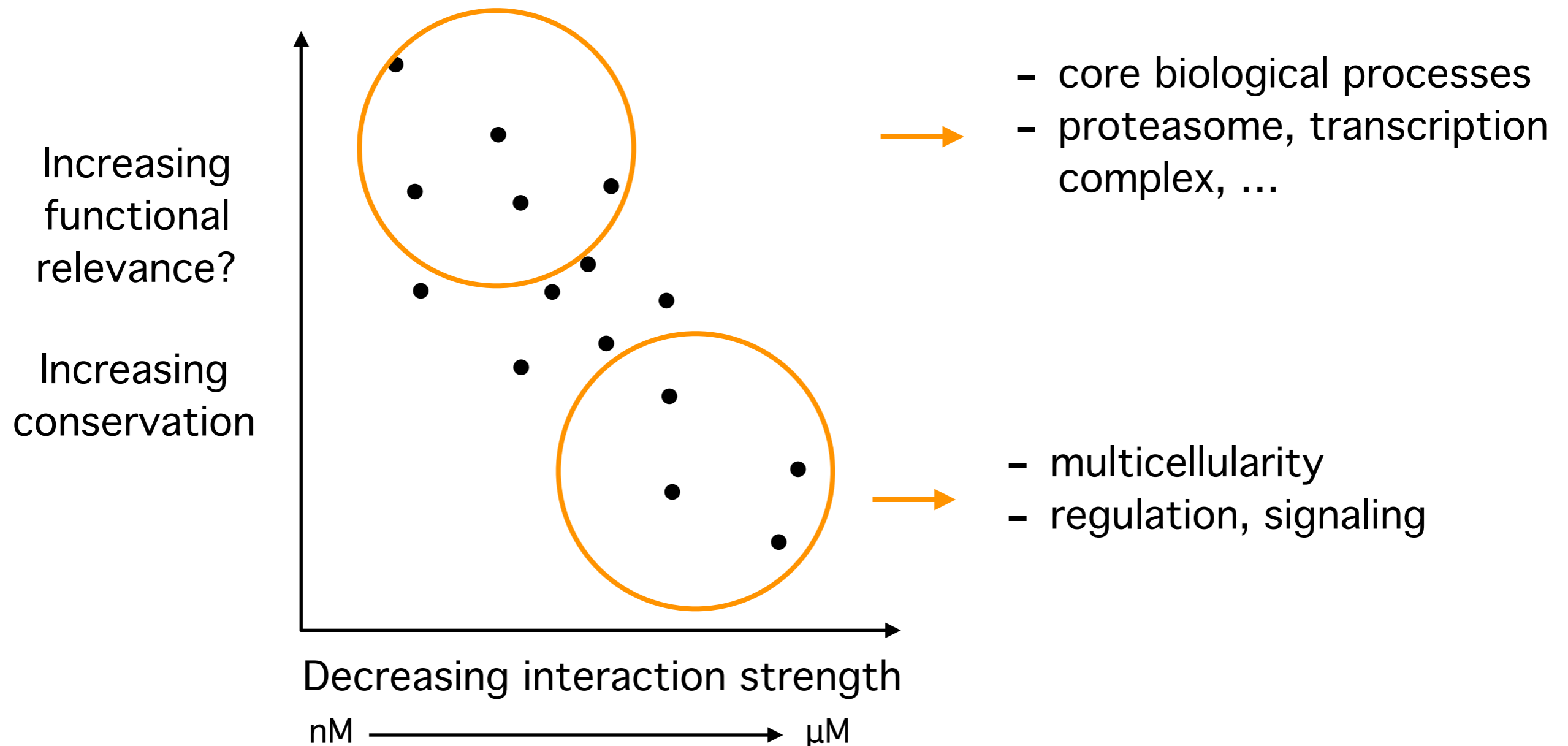
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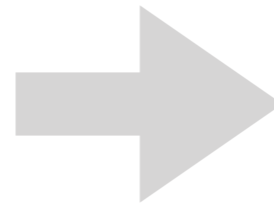
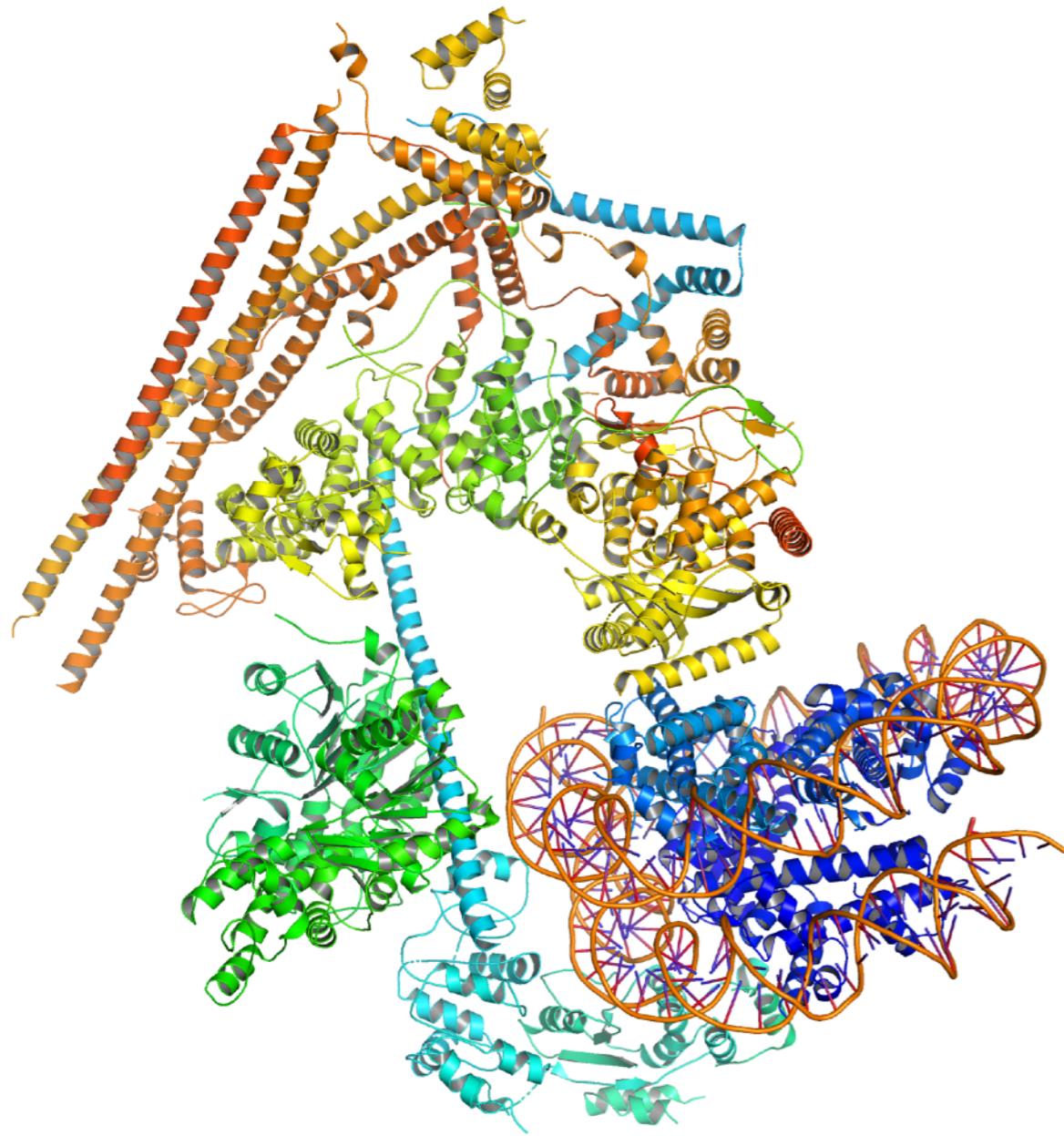
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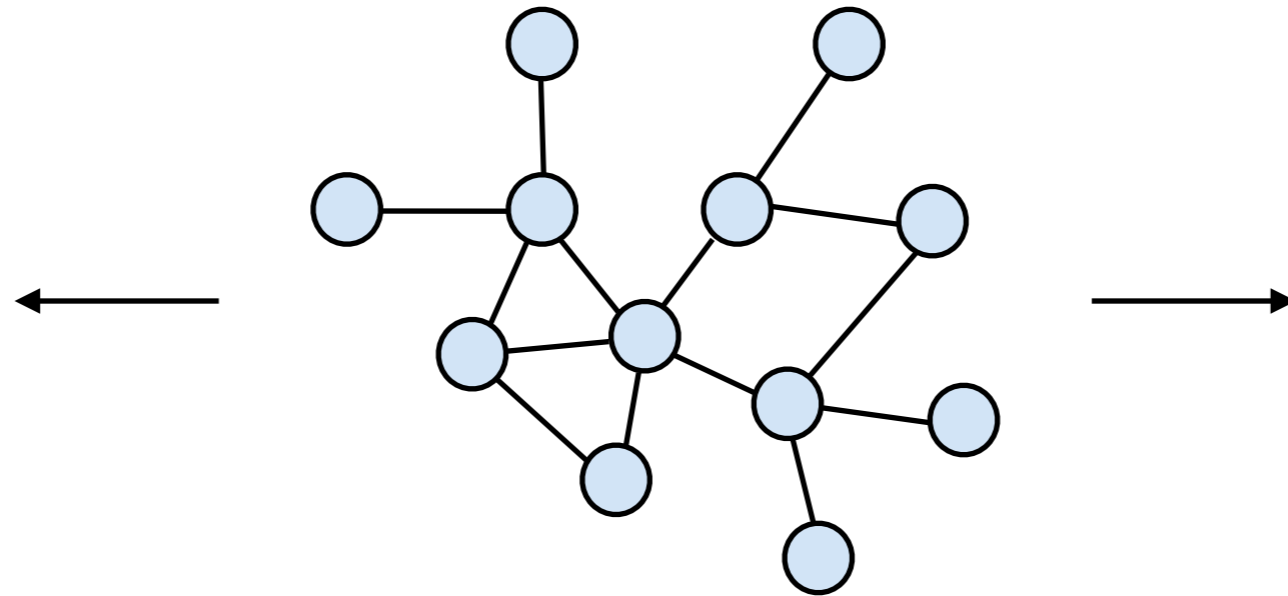
All life depends on the proper formation and dissociation of protein interactions



Mechanisms of protein interaction specificity?

# If we knew all (human) protein interactions...

Complete  
functional  
annotation  
of all genes



Complete  
understanding of  
human biology

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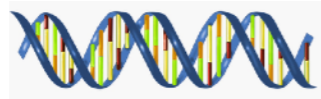
Session: Protein interaction networks

## 2. Methods to detect protein interactions

Why is it so hard to detect protein interactions?

# Why is it so hard to detect protein interactions?

Genome



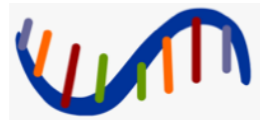
Next generation sequencing



Great sensitivity



Transcriptome

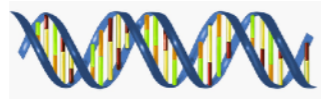


Next generation sequencing



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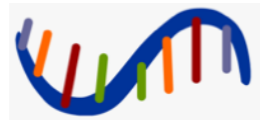
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Next generation sequencing



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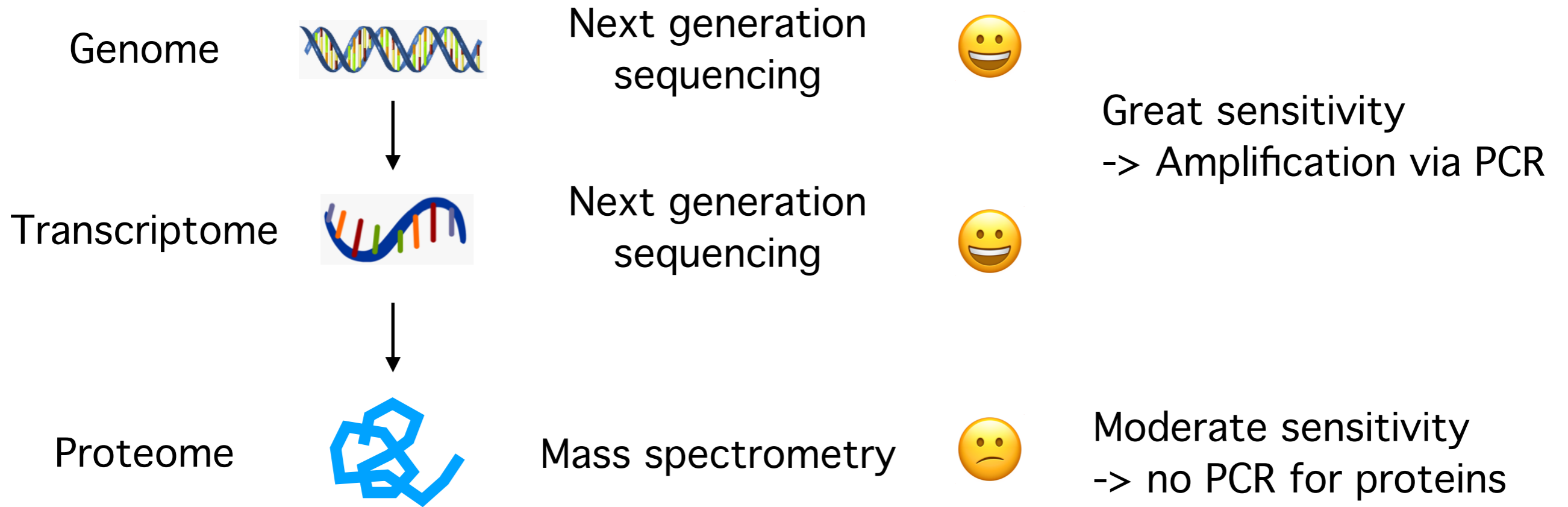


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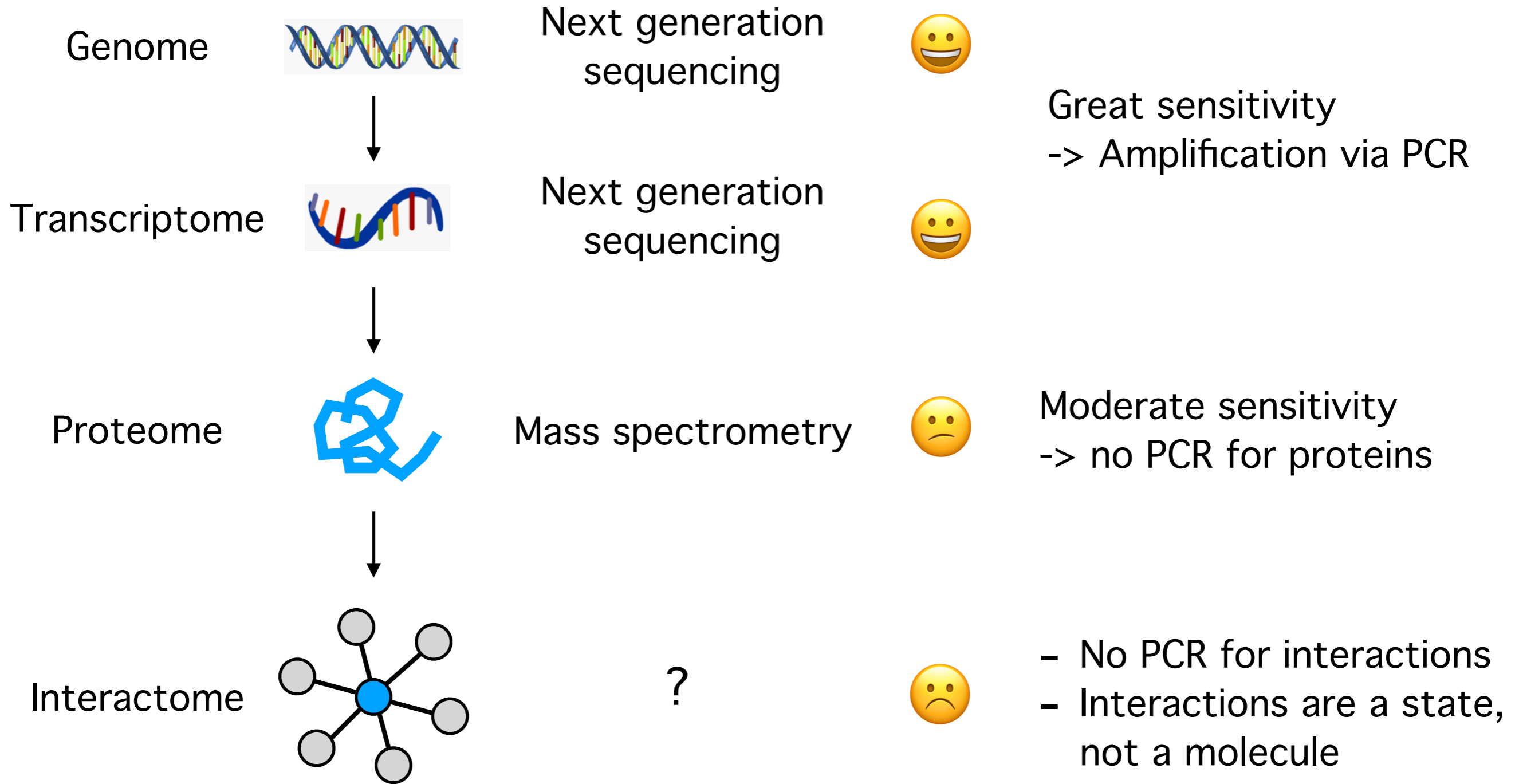


Great sensitivity  
-> Amplification via PCR

# Why is it so hard to detect protein interactions?



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# Approaches to detect protein interactions

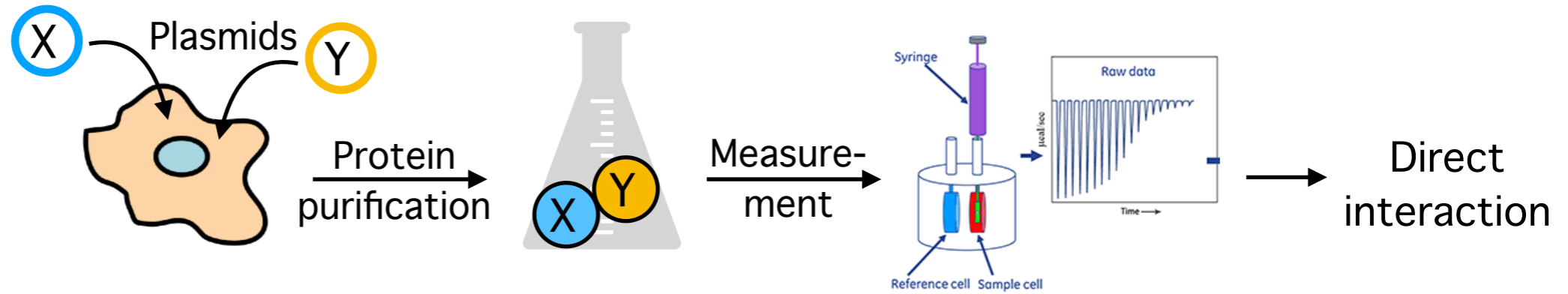
- interaction detection method
  - experimental interaction detection
    - biochemical
      - affinity technology
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      - enzymatic study
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      - nucleotide exchange assay
      - polymerization
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    - biophysical
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<https://www.ebi.ac.uk/ols/ontologies/mi>

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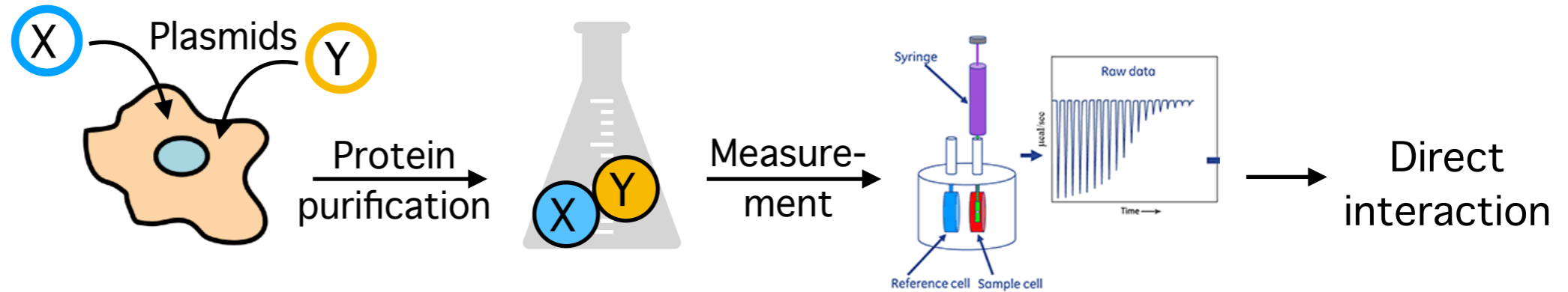
## Detection of direct interactions



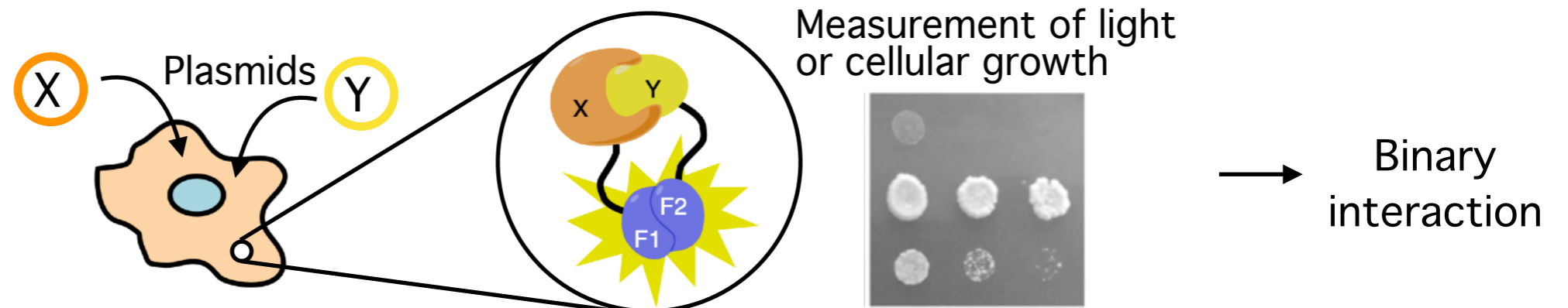
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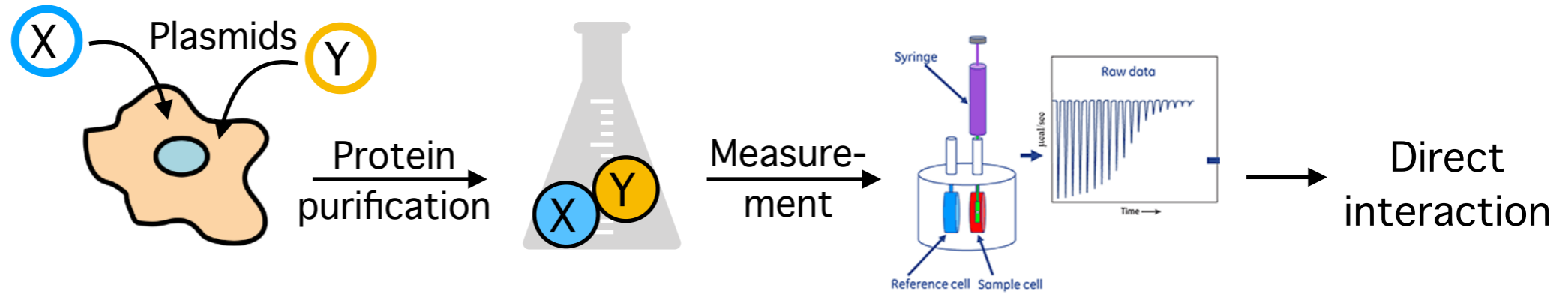
## Detection of binary interactions



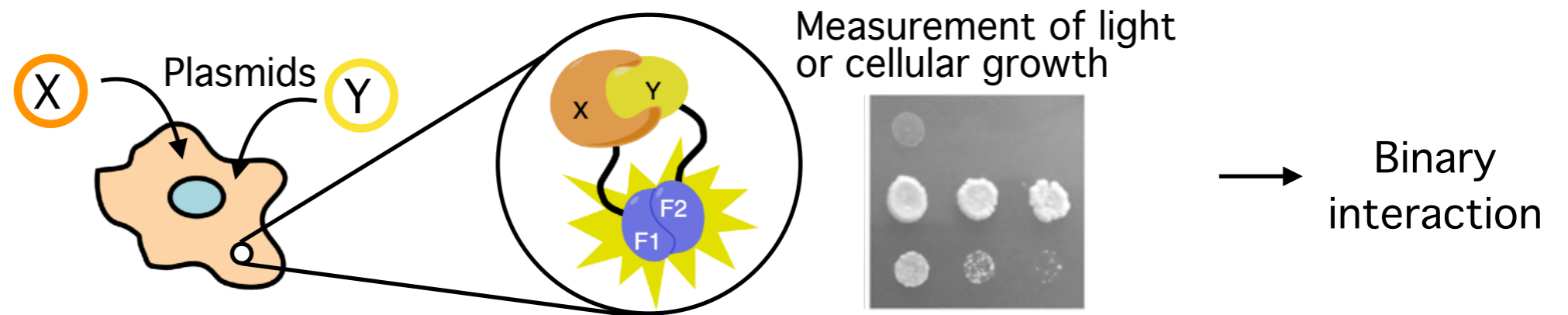
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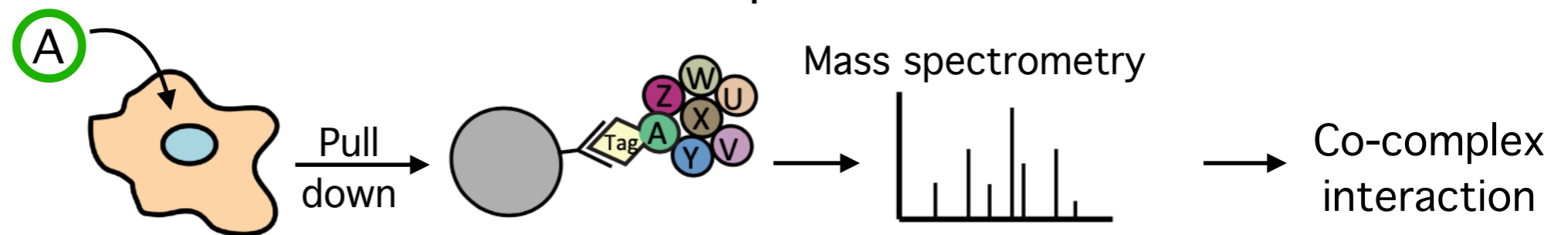
## Detection of direct interactions



## Detection of binary interactions



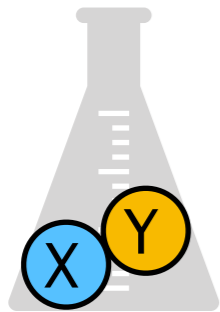
## Detection of co-complex associations



# Different assays produce different types of protein interaction data

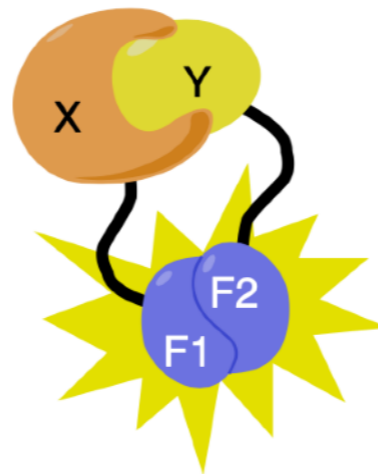
## Direct assays

- direct interactions
- protein fragments
- with  $K_D$
- low-throughput



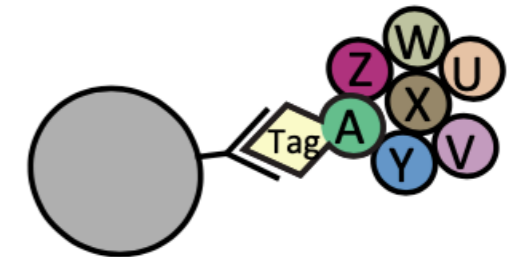
## Binary assays

- binary interactions
- full length proteins
- no  $K_D$
- over-expression



## Co-complex assays

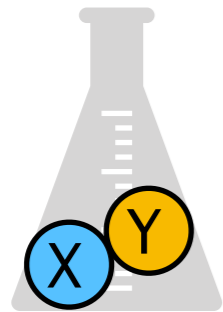
- co-complex associations
- full length proteins
- no  $K_D$
- over-expression and endogenous



# Different assays produce different types of protein interaction data

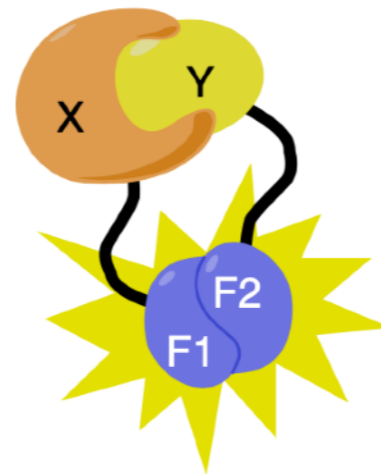
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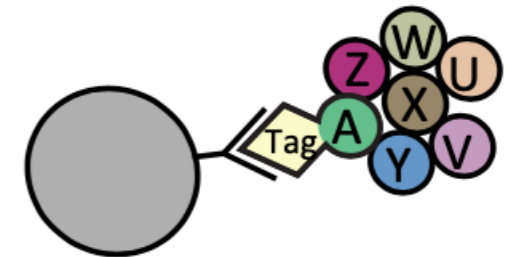
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## Co-complex assays

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- no  $K_D$
- over-expression and endogenous



- all are called protein interactions
- assays differ in which interactions they can detect

# Accuracy of protein interaction assays

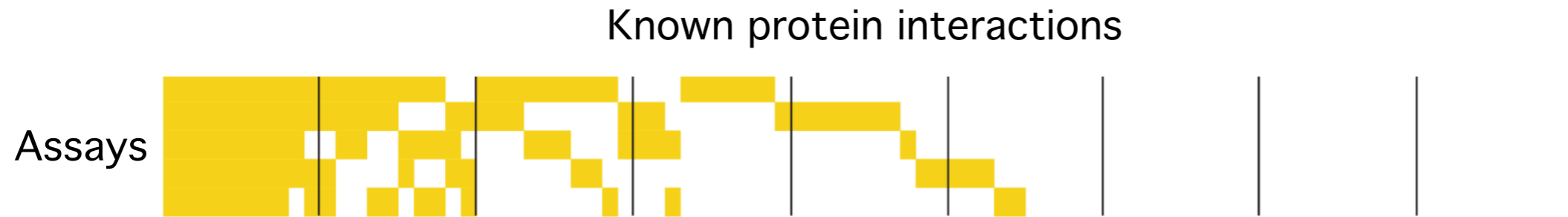
## Sensitivity of protein interaction assays





# Accuracy of protein interaction assays

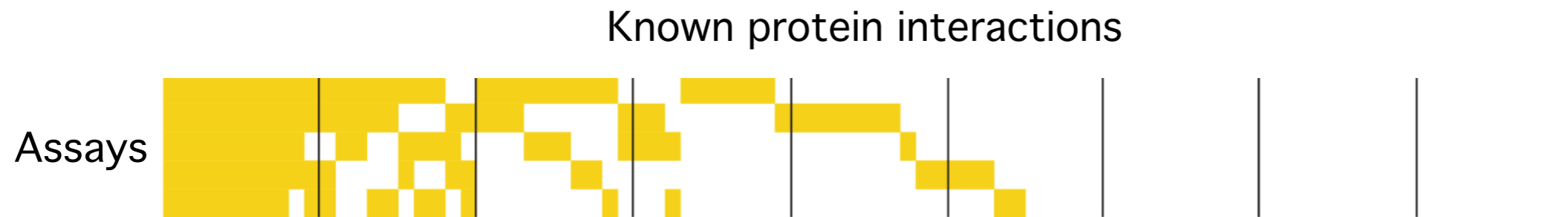
## Sensitivity of protein interaction assays



Why are some interactions detected by some assays and not by others?

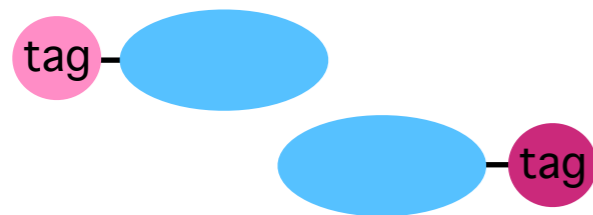
# Accuracy of protein interaction assays

## Sensitivity of protein interaction assays



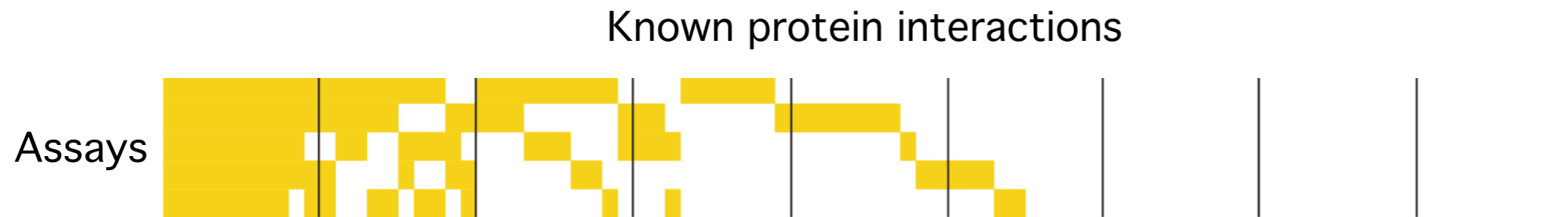
Why are some interactions detected by some assays and not by others?

Protein fusions

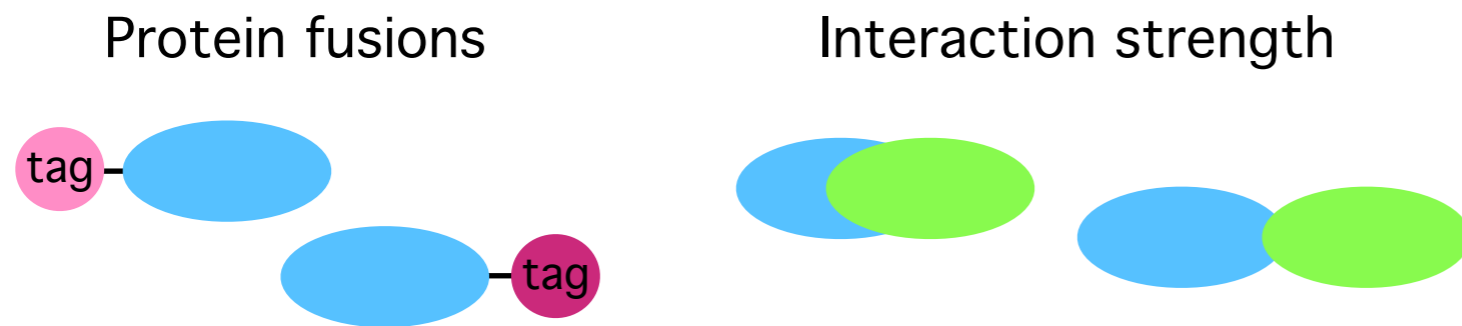


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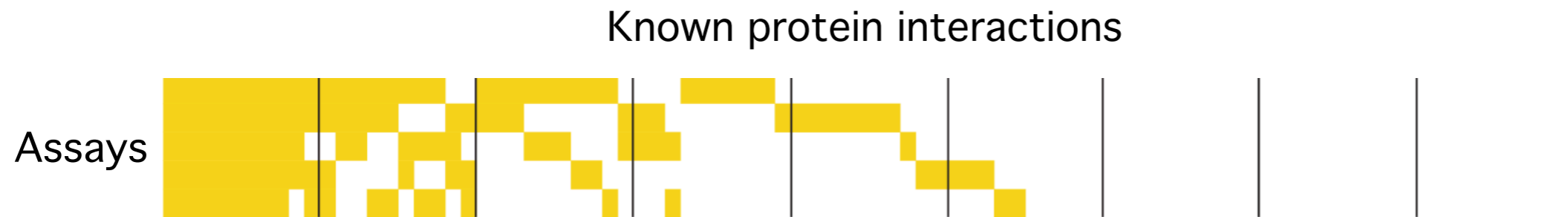


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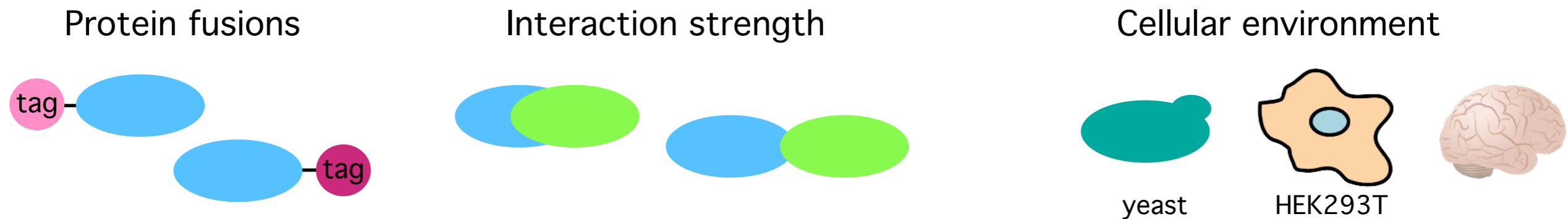


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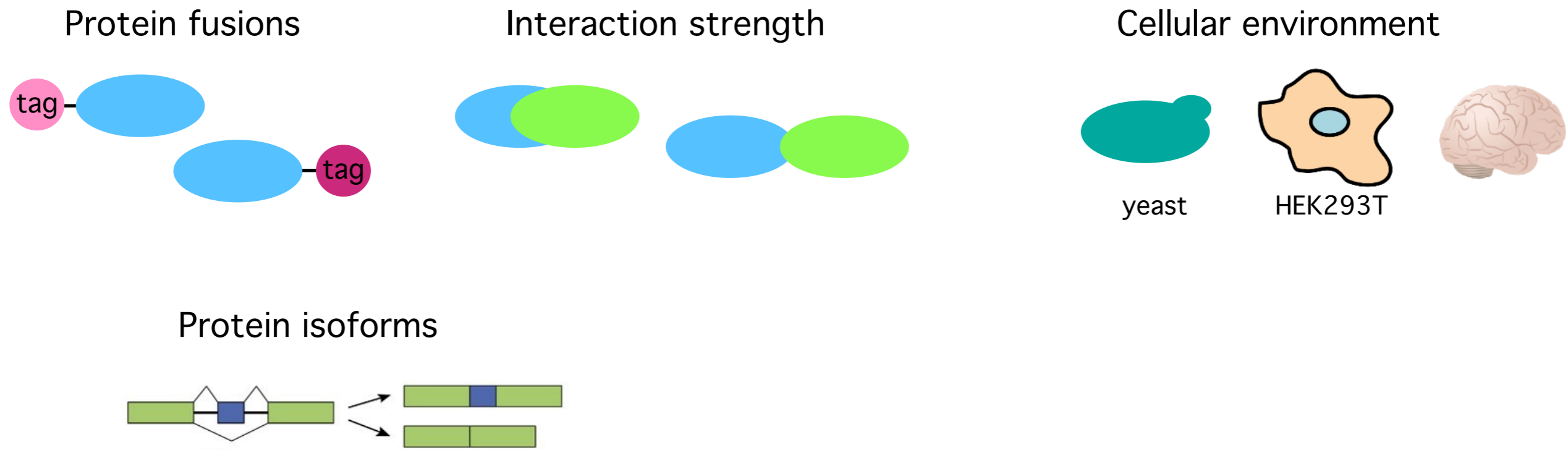


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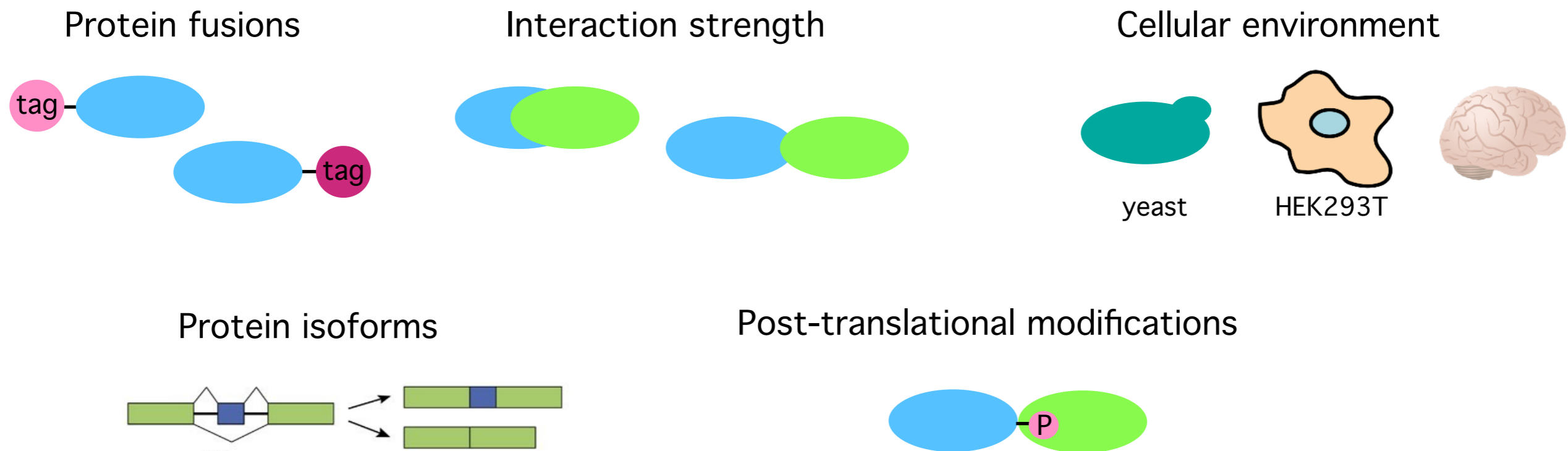


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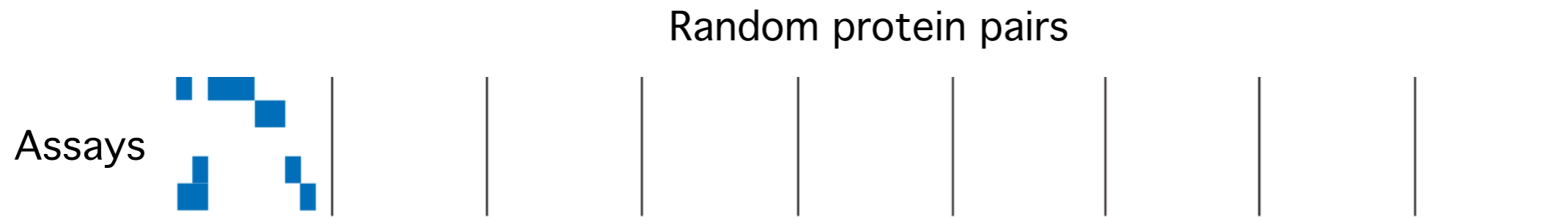


# Accuracy of protein interaction assays

## Specificity of protein interaction assays

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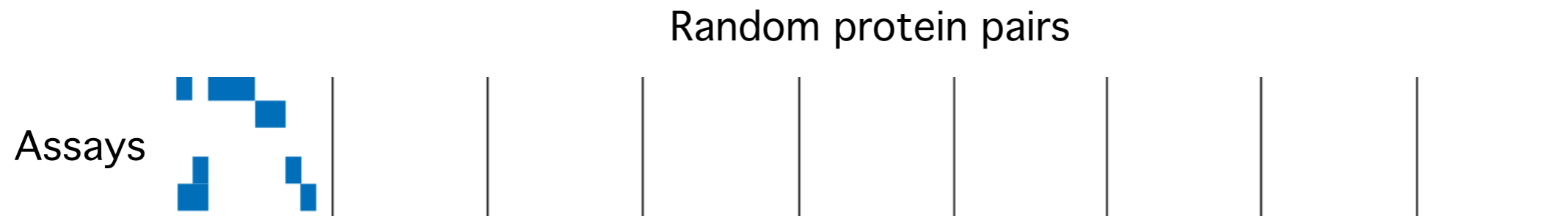
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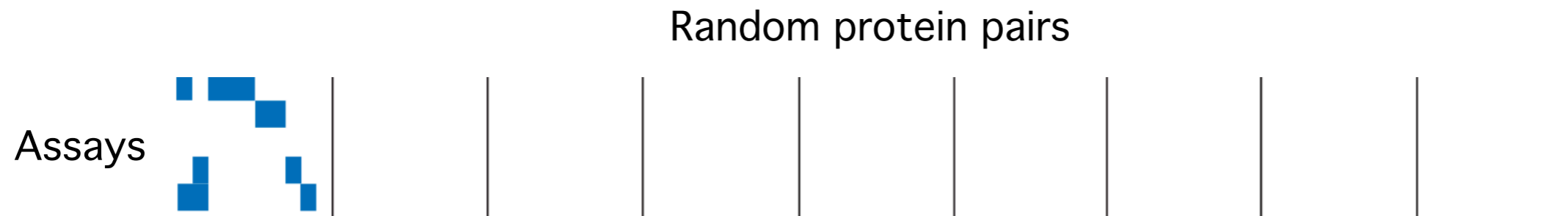
## Specificity of protein interaction assays



Why would an assay erroneously report a protein interaction?

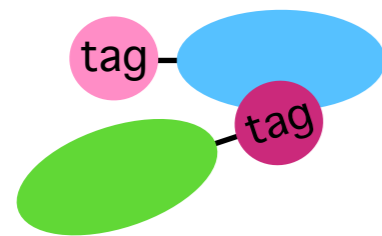
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## Specificity of protein interaction assays



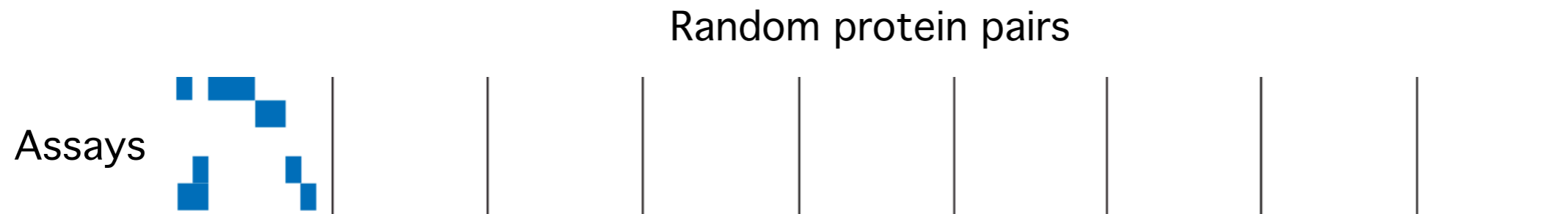
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Protein fusions



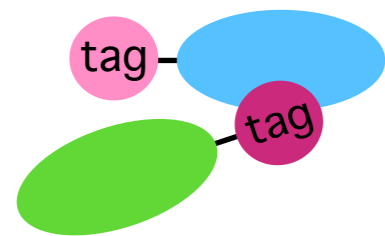
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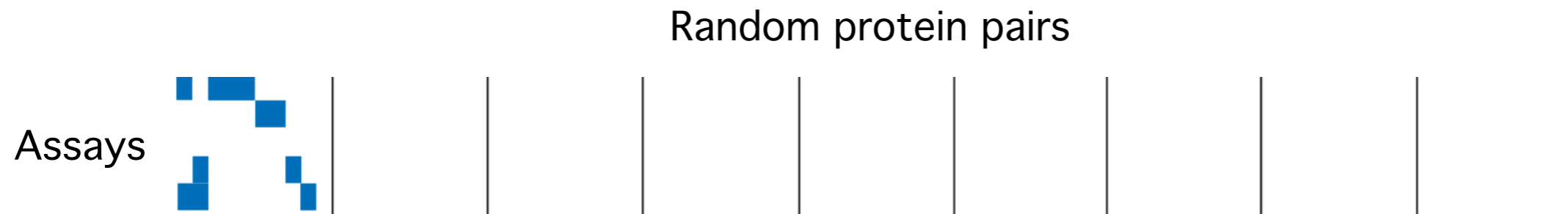


Contamination (AP-MS)



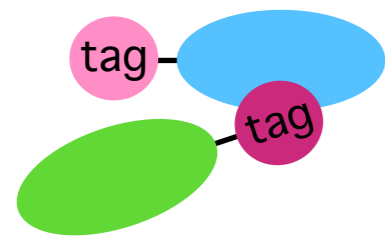
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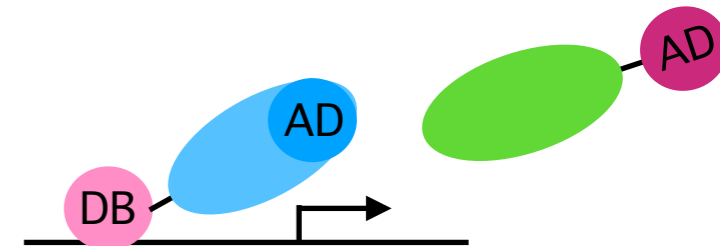
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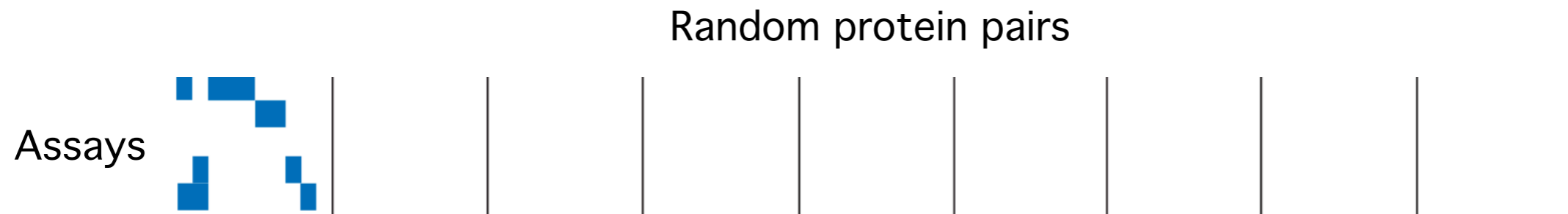


Auto-activation (Y2H)



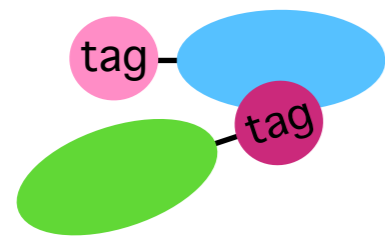
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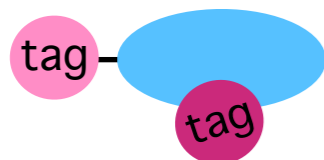


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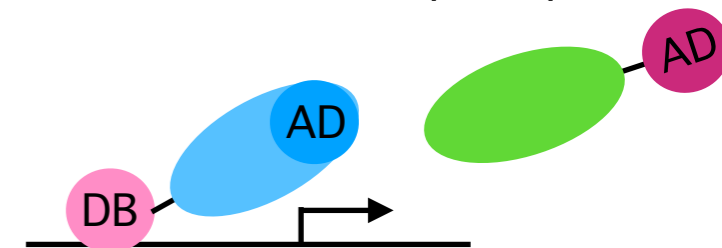
Control



Contamination (AP-MS)

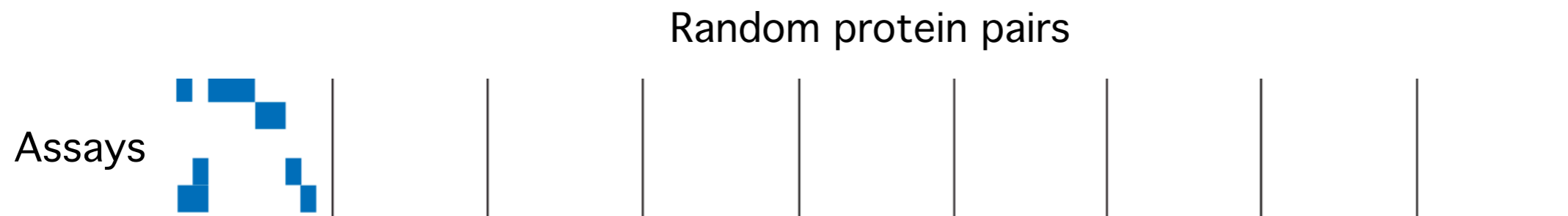


Auto-activation (Y2H)



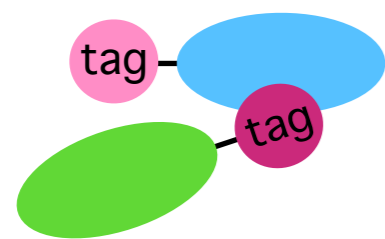
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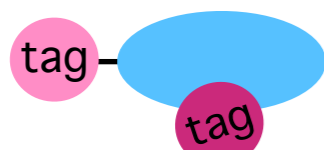


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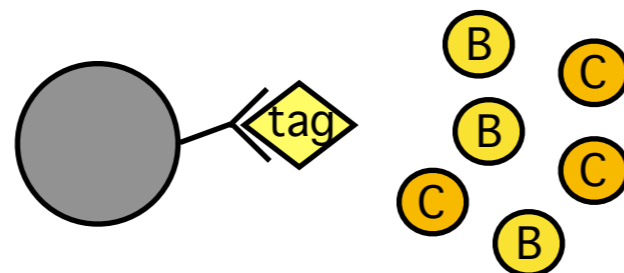
Control



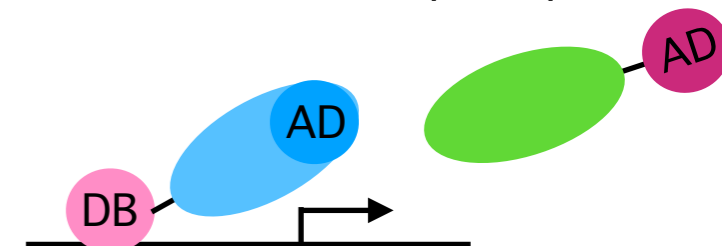
Contamination (AP-MS)



Control

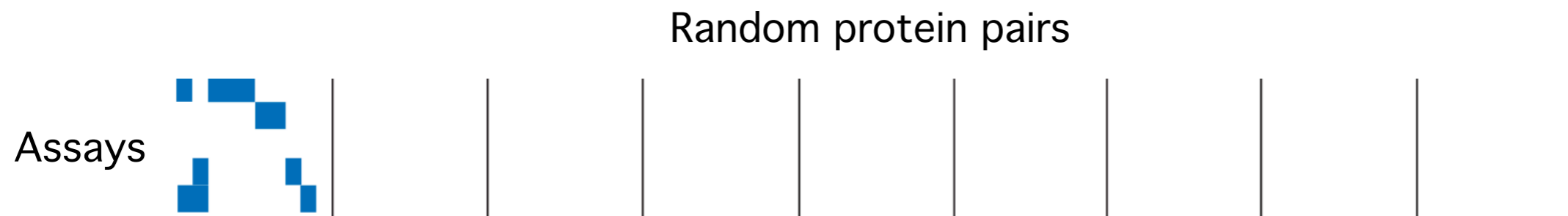


Auto-activation (Y2H)



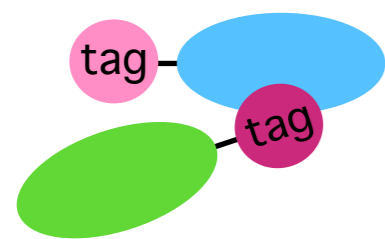
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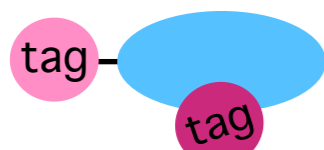


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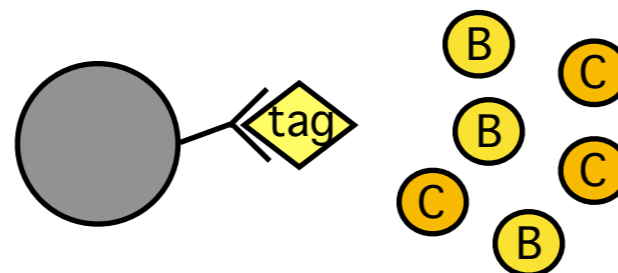
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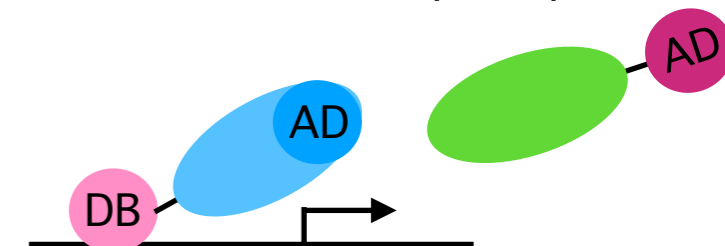
Contamination (AP-MS)



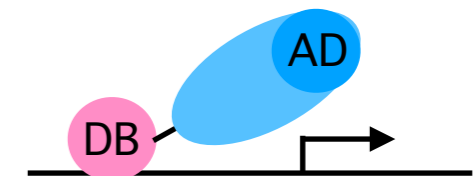
Control



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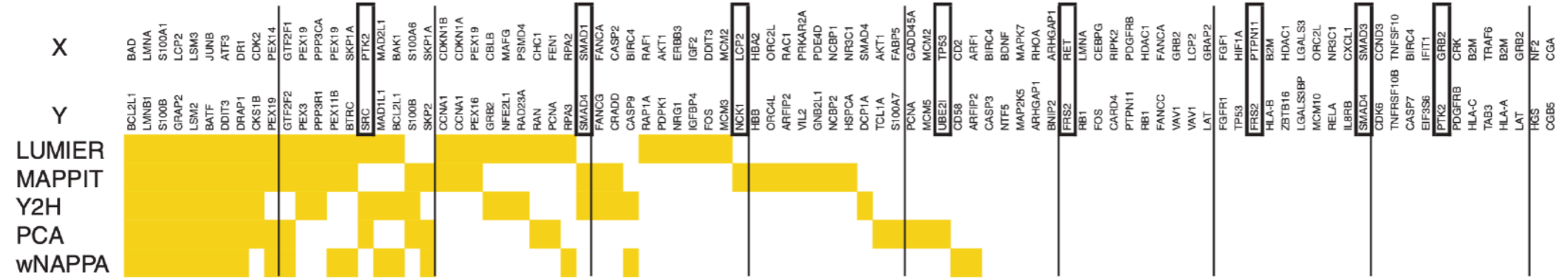
Control



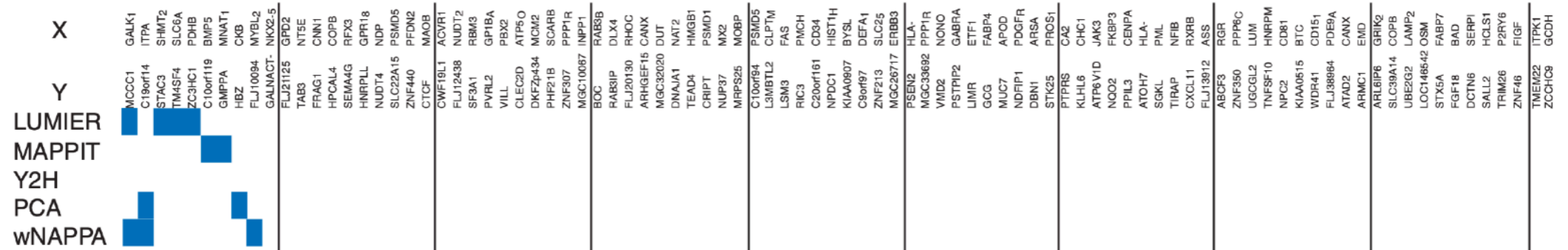
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## Correct benchmarking of assays

### Positive reference set



### Random reference set

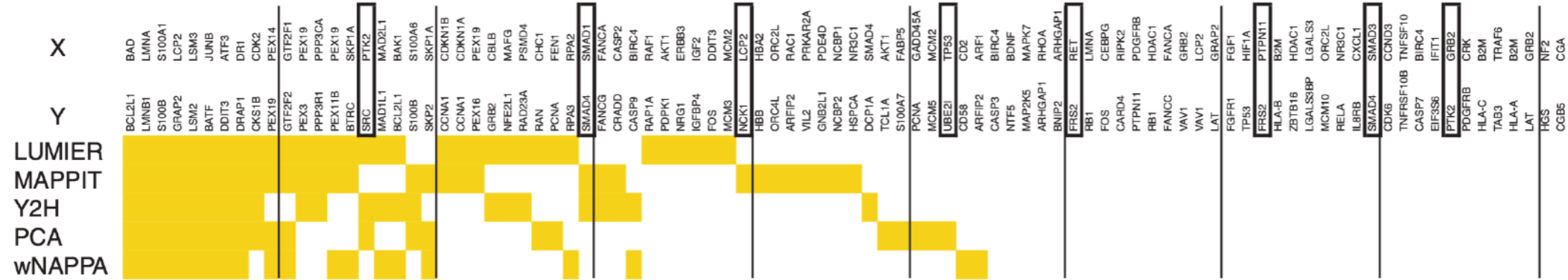




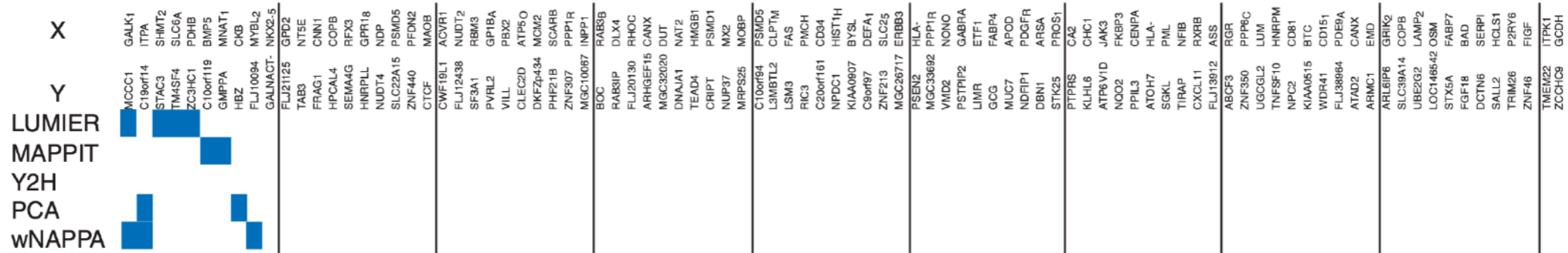
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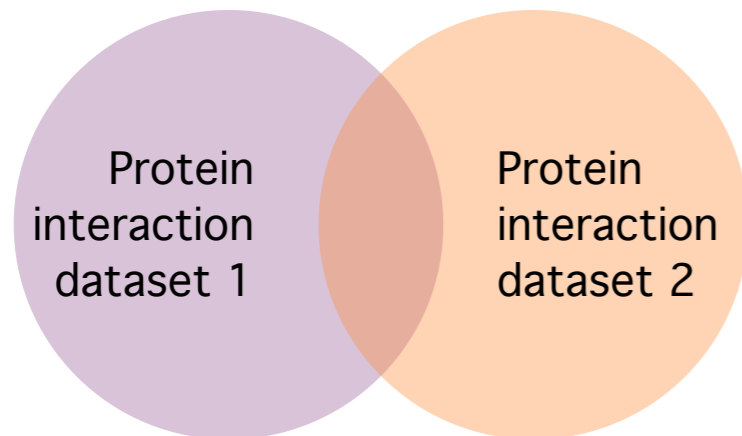


Random reference set



## Correct interpretation of protein interaction data

Low overlap



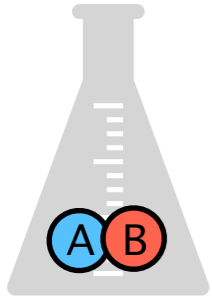
Low sensitivity  
High specificity

# Functional relevance of detected protein interactions

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Often artificial context when protein interaction is detected

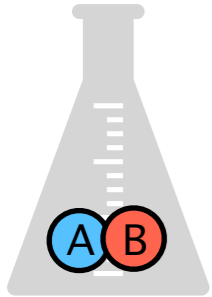
In vitro



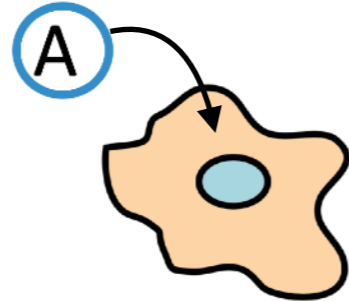
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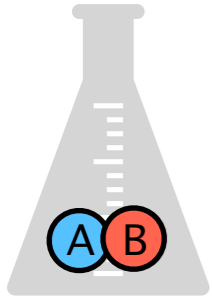
Exogenous expression



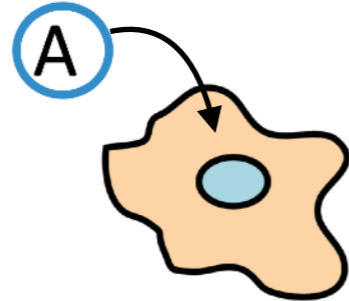
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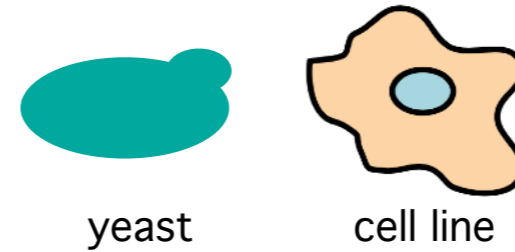
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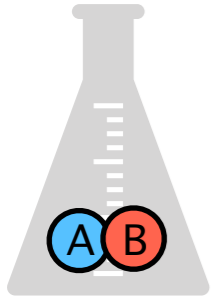
Cellular context



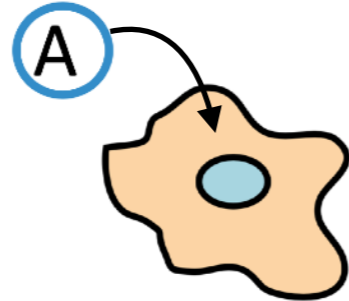
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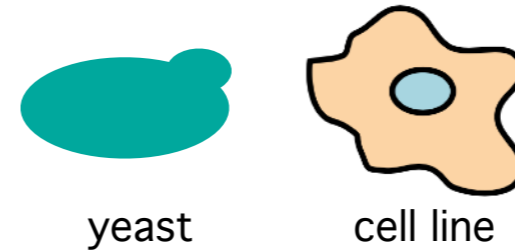
In vitro



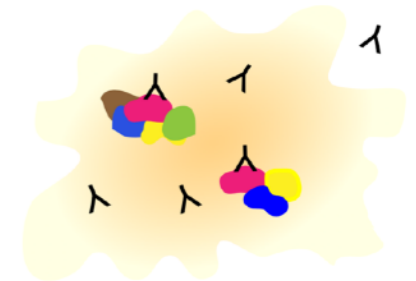
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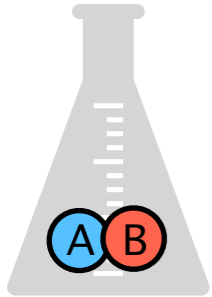
Cell lysis



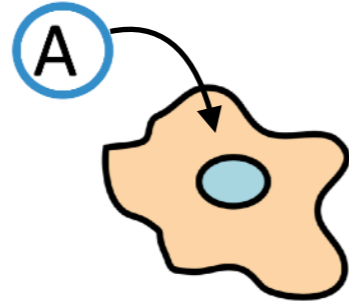
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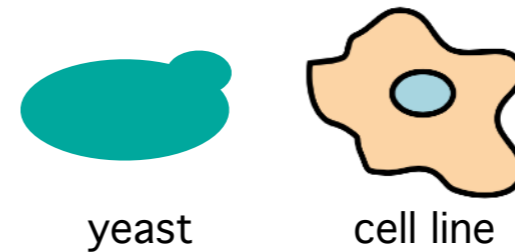
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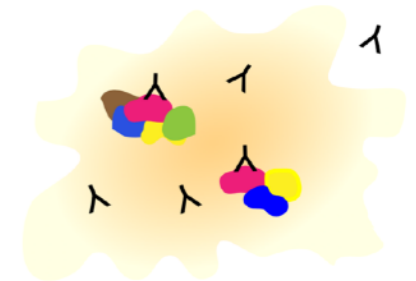
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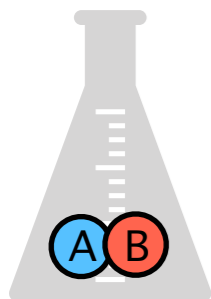


At which cellular context is a detected protein interaction functional?

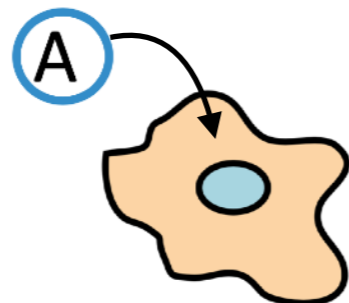
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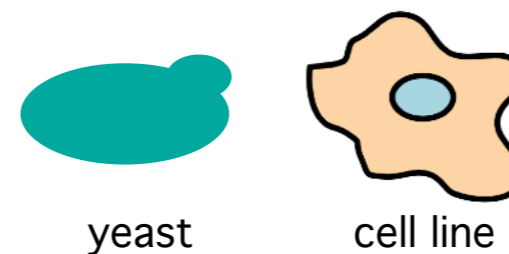
In vitro



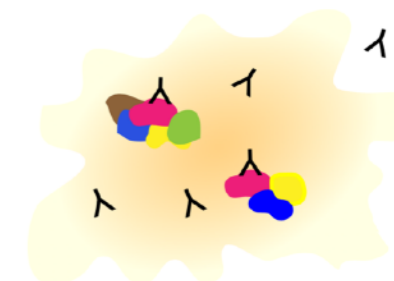
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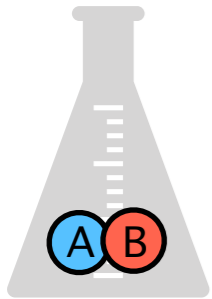
Should we delete 'non-functional' interactions?



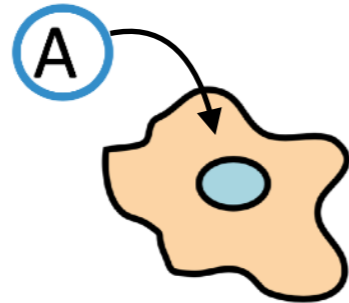
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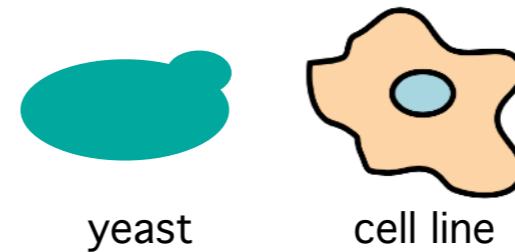
In vitro



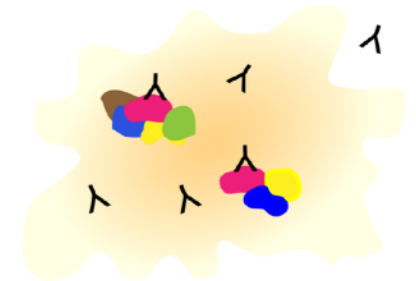
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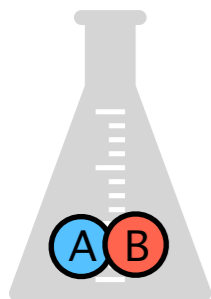
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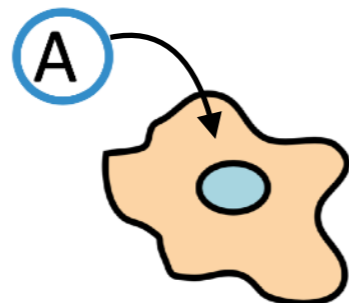
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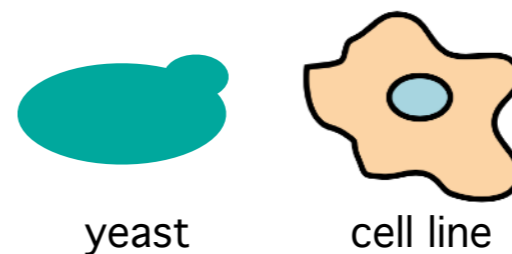
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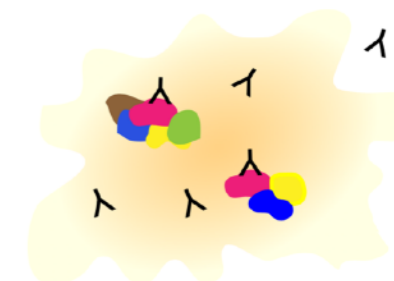
Exogenous expression



Cellular context

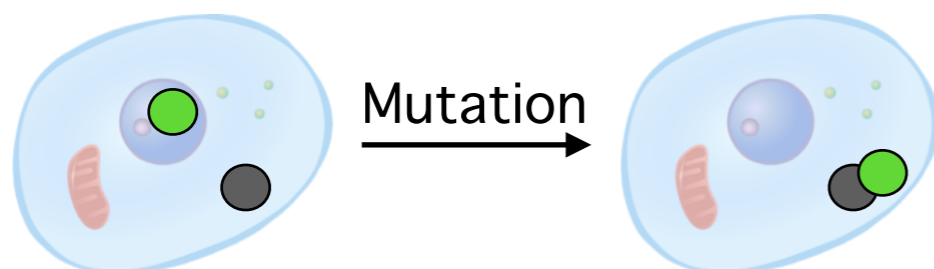


Cell lysis



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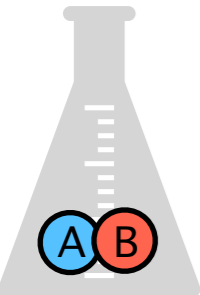
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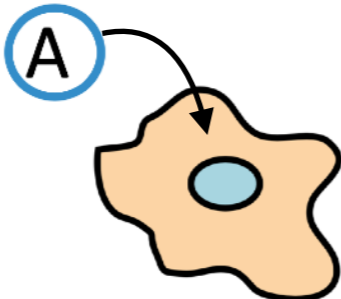
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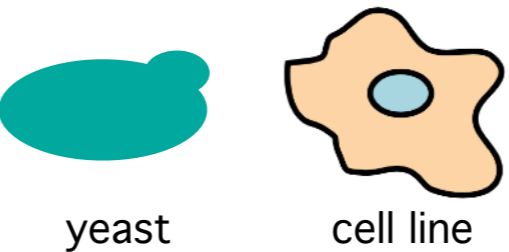
In vitro



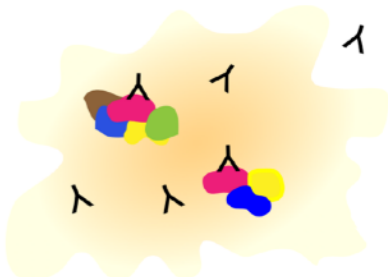
Exogenous expression



Cellular context

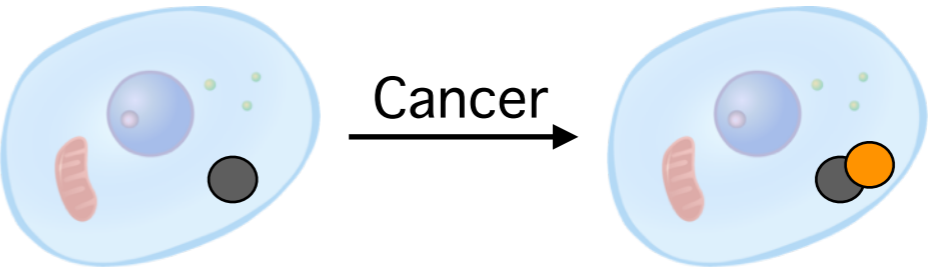
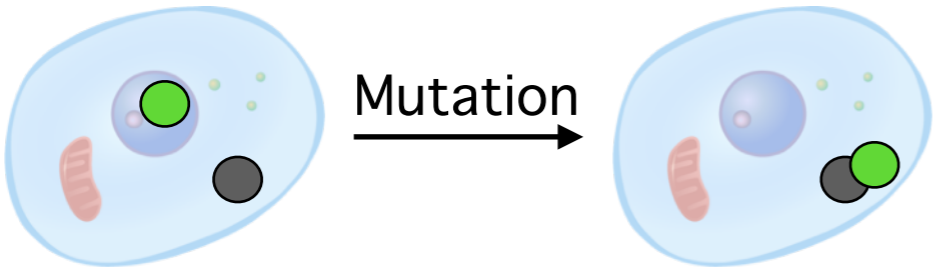


Cell lysis



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# Methods to detected protein interactions

## Summary

- interaction strength is a continuum
- most common methods are direct, binary, and co-complex assays
- different methods detect different types of protein interactions
- many interactions remain undetected
- if properly controlled interaction data can be of high quality
- it is difficult to distinguish between functional and non-functional protein interactions